

INFORMATION QUALITY MANAGEMENT:

The Next Frontier

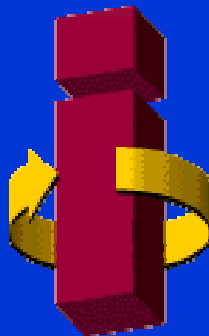
ArchitecturePlus

Washington, DC

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by:

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Larry P. English

President and Principal



Mr. English is an internationally recognized speaker, educator, author and consultant in information and knowledge management and information quality improvement. He also provides consulting and education in information stewardship, strategic information visioning, information technology evaluation, information resource management and data administration, data modeling and facilitation, and value-centric application development methods. Mr. English has developed the Total Quality data Management (TQdM®) methodology applying Kaizen® quality principles to information quality management. He chairs Information Quality Conferences around the world.

Prior to founding INFORMATION IMPACT INTERNATIONAL, Inc. (www.infoimpact.com), Brentwood, TN, over twelve years ago, Mr. English was Vice President of an international IRM consulting firm. Before that, he was manager of systems development and then for information management with a large publishing firm. Before positions as Senior Instructor for a computer manufacturer and Information Systems Training Coordinator for a major insurance firm, Mr. English began his career with Sears, Roebuck, and Co., as a programmer and systems analyst.

DAMA awarded him the 1998 “Individual Achievement Award” for his contributions to the field of information resource management. Mr. English has served as an Adjunct Associate Professor in computer science. He is a member and a strategic business partner of the American Society for Quality (ASQ). Mr. English has been an active member of various ANSI (American National Standards Institute) standards committees, and he is an editorial advisor for *DM Review*.

A magna cum laude graduate of Hardin-Simmons University, Mr. English holds a Masters Degree from the Southern Baptist Theological Seminary where he was a Luther Rice Scholar and a Garrett Fellow. He is listed in Outstanding Young Men in America and Who’s Who Worldwide. He has provided consulting and educational services in more than 25 countries on five continents to such organizations as Aera Energy, Air Canada, American Express, Belgacom, Boeing, British Telecom, Capital Bank, Coca-Cola Foods, Dow Chemical, Eastman Kodak, Eli Lilly, the FDIC, Hewlett-Packard, The Hartford, IBM, L. L. Bean, NTT DATA, Optical Fibres, Sprint, Telenor, UNUM Life Insurance Co., the U.S. Navy, Western Health Alliance and Weyerhaeuser.

A frequent keynote speaker, Mr. English writes the monthly “Plain English on Data Quality” column for *DM Review*, and is the author of the highly acclaimed *Improving Data Warehouse and Business Information Quality*, now being translated into Japanese, and numerous articles for publications in the US and Europe.

INFORMATION QUALITY MANAGEMENT

Agenda

1. Information Quality: What and Why
2. Assessing Business Information Quality
3. Quantifying Nonquality Information Costs
4. Improving Information *Product* Quality
5. Improving Information *Process* Quality
6. Implementing and Sustaining an Information Quality Improvement Environment

COST OF NONQUALITY DATA?

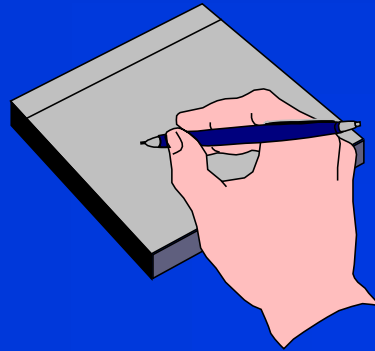
What is your estimate of the costs of non-quality data to your organization, *as a percent of enterprise revenue?* (Non-quality data costs include time and materials in: recovery from process failure, rework, work-arounds, wasted materials, data verification to clean up, redundant computing resources used, customer compensation, etc. as a result of missing or inaccurate data.)

- | | | | |
|------------------------------------|------------------------------------|------------------------------------|-----------------------------------|
| <input type="checkbox"/> 0 – <1% | <input type="checkbox"/> 1 – <2.5% | <input type="checkbox"/> 2.5 – <5% | <input type="checkbox"/> 5 – <10% |
| <input type="checkbox"/> 10 – <15% | <input type="checkbox"/> 15 – <20% | <input type="checkbox"/> >20% | |

This estimate is based on:

- ☐ Some measurement, or ☐ A guess

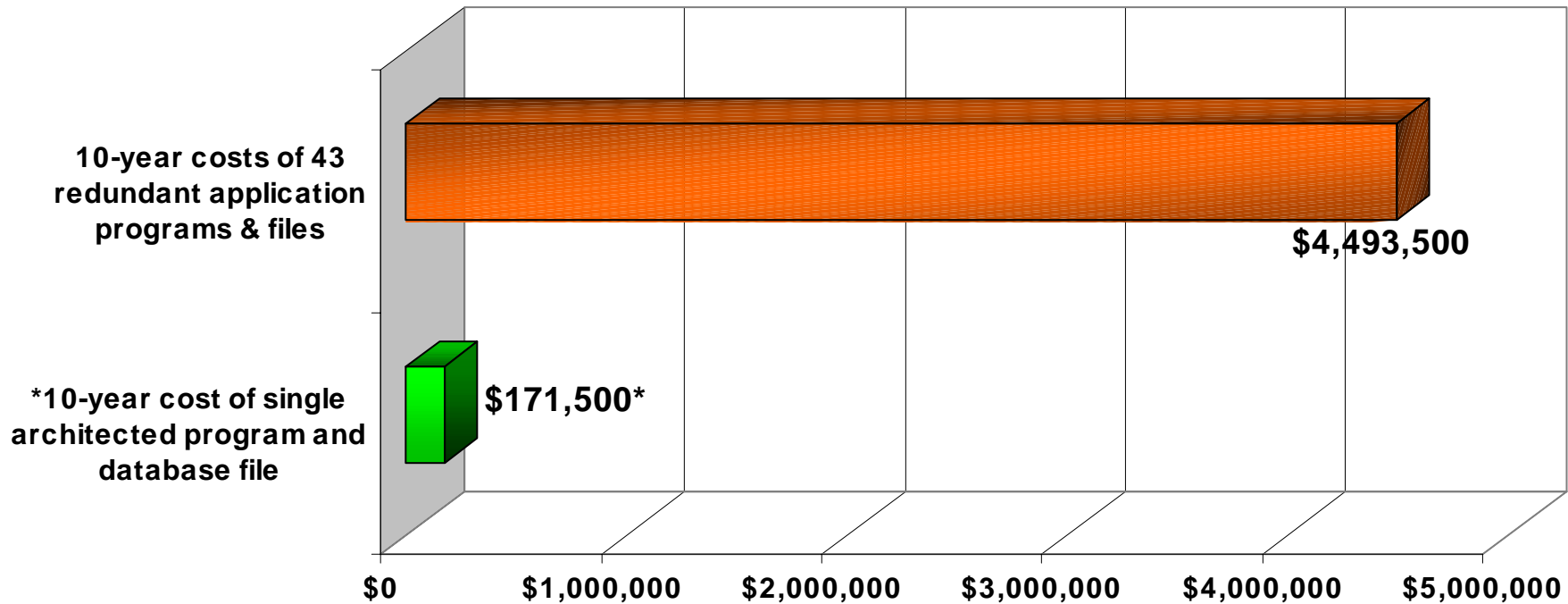
1. Defining Information Quality: What and Why



“Beauty is in the eye of the beholder” Margaret Hungerford

Improving Data Warehouse and Business Information Quality, Chapter 2, pp 15 - 30

REDUNDANT SYSTEMS DEVELOPMENT COSTS

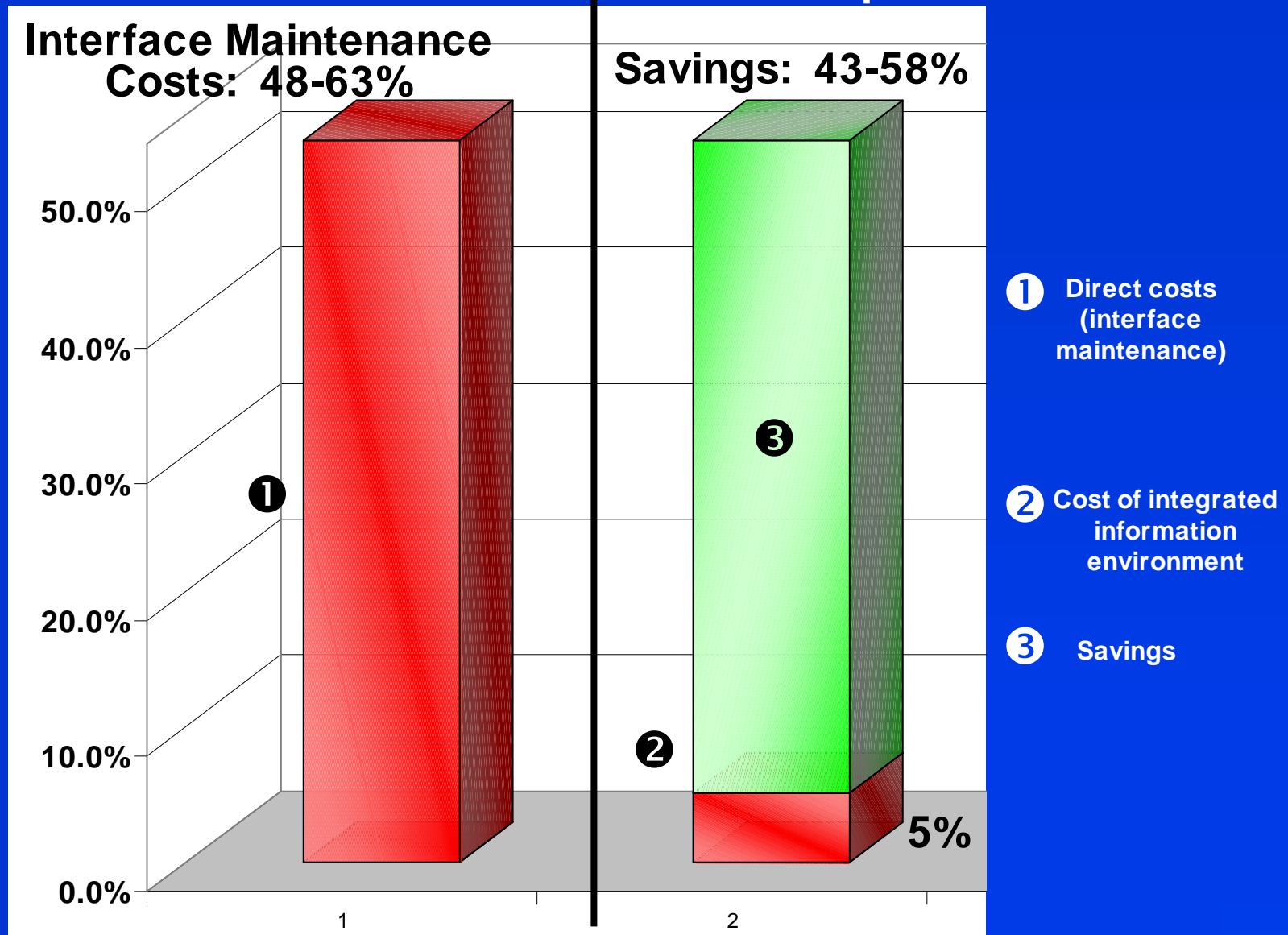


- Double cost to model data across enterprise
- Double cost to build shared application
- Double cost of operating a single shared database compared with 43 individual redundant applications
- 40% wage increase to information producer because of higher value of work

COSTS OF I / S QUALITY AS A PERCENT OF I / S BUDGET

Organization with no information
management process

Organization with mature
information management
process

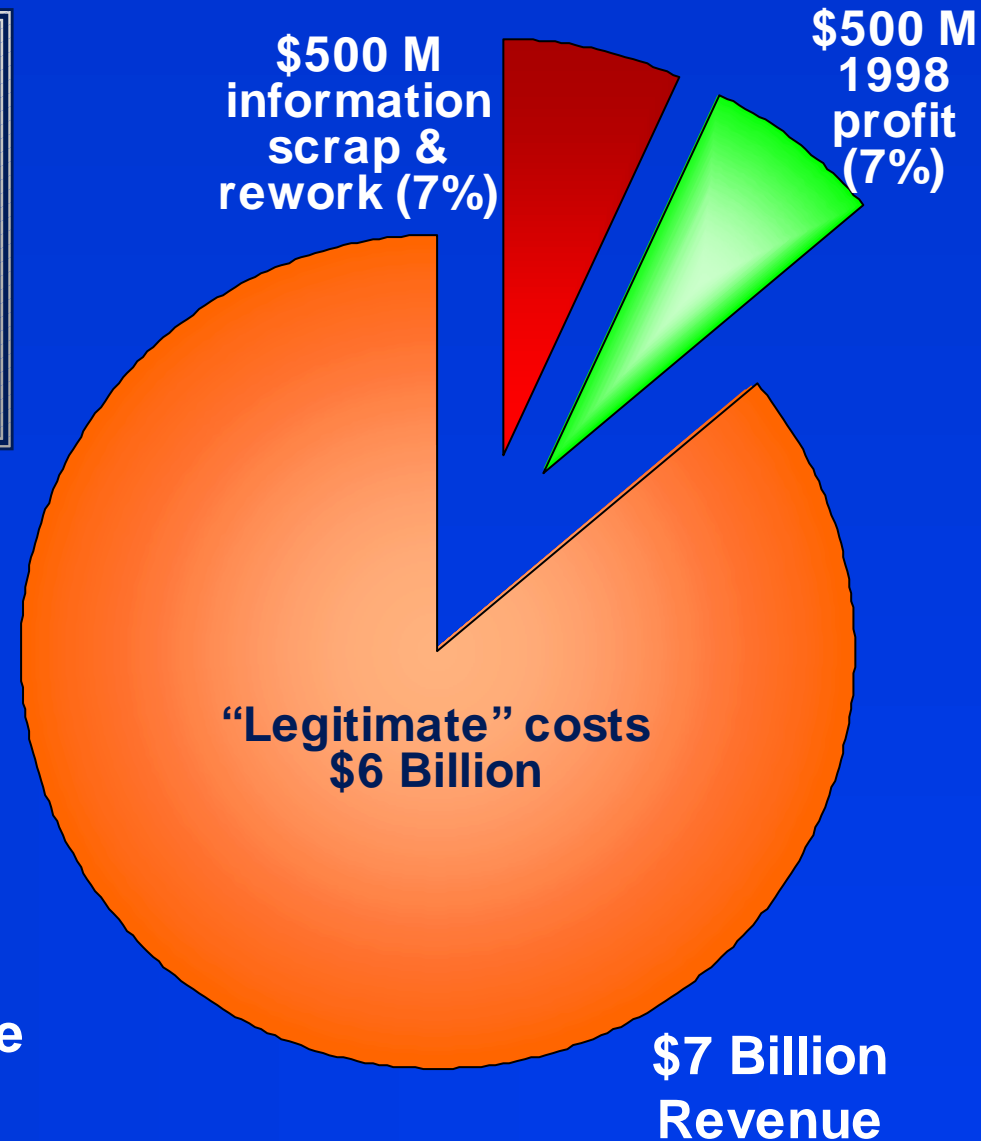


COST OF NONQUALITY INFORMATION

Perception and Reality

**“Our data quality isn’t so bad.
We haven’t heard any
complaints from users.”**

-Data Quality manager



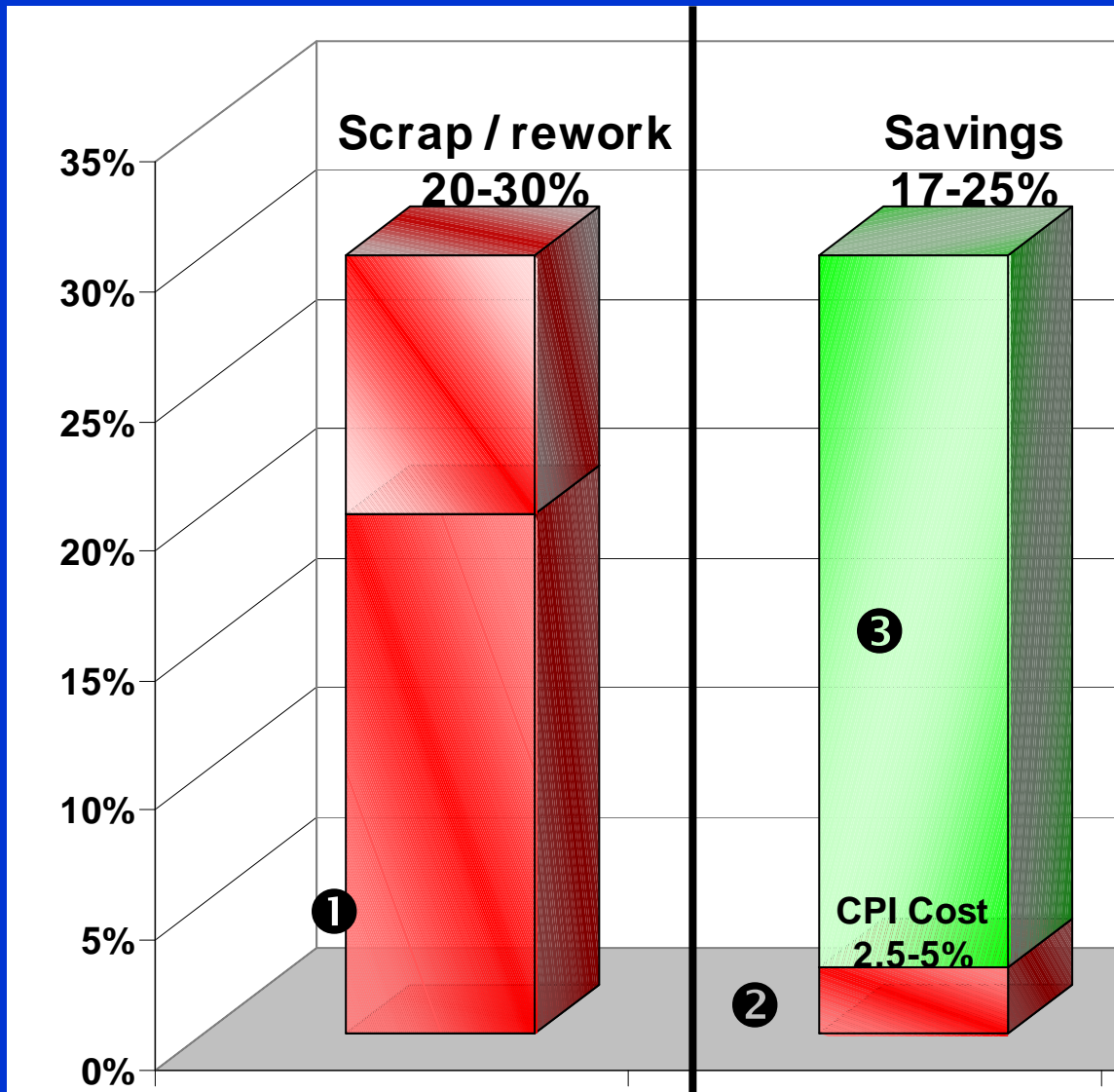
**Cost of nonquality information
case study:**

**Labor costs *alone* in Information
scrap and rework = 7% of revenue**

DIRECT COSTS OF QUALITY AS A PERCENT OF REVENUE

**Organization
with no quality
improvement
process**

**Organization with
mature quality
improvement
process**



*** Does not
include
opportunity loss**

**Source: P. Crosby,
*Quality is Free***

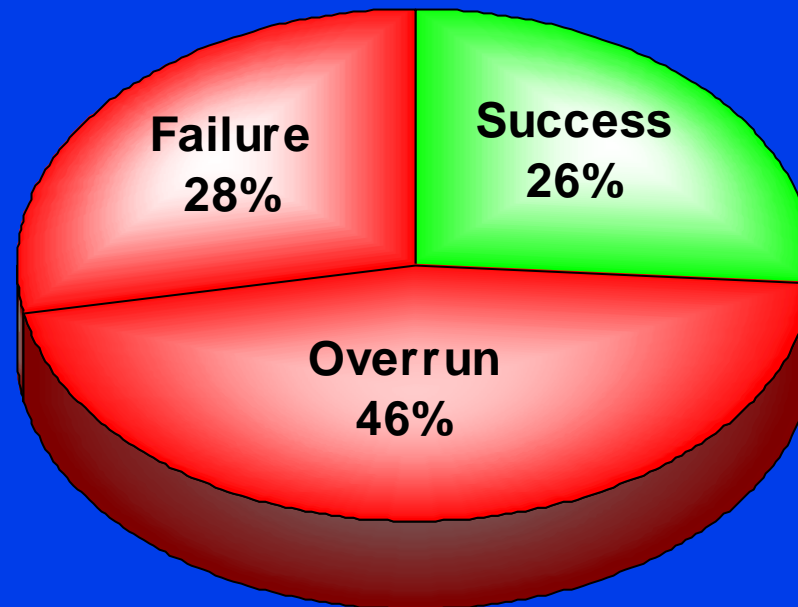
① Direct costs (inc: non-recoverable, re-work, cust complaint handling)

② Cost of defect prevention program

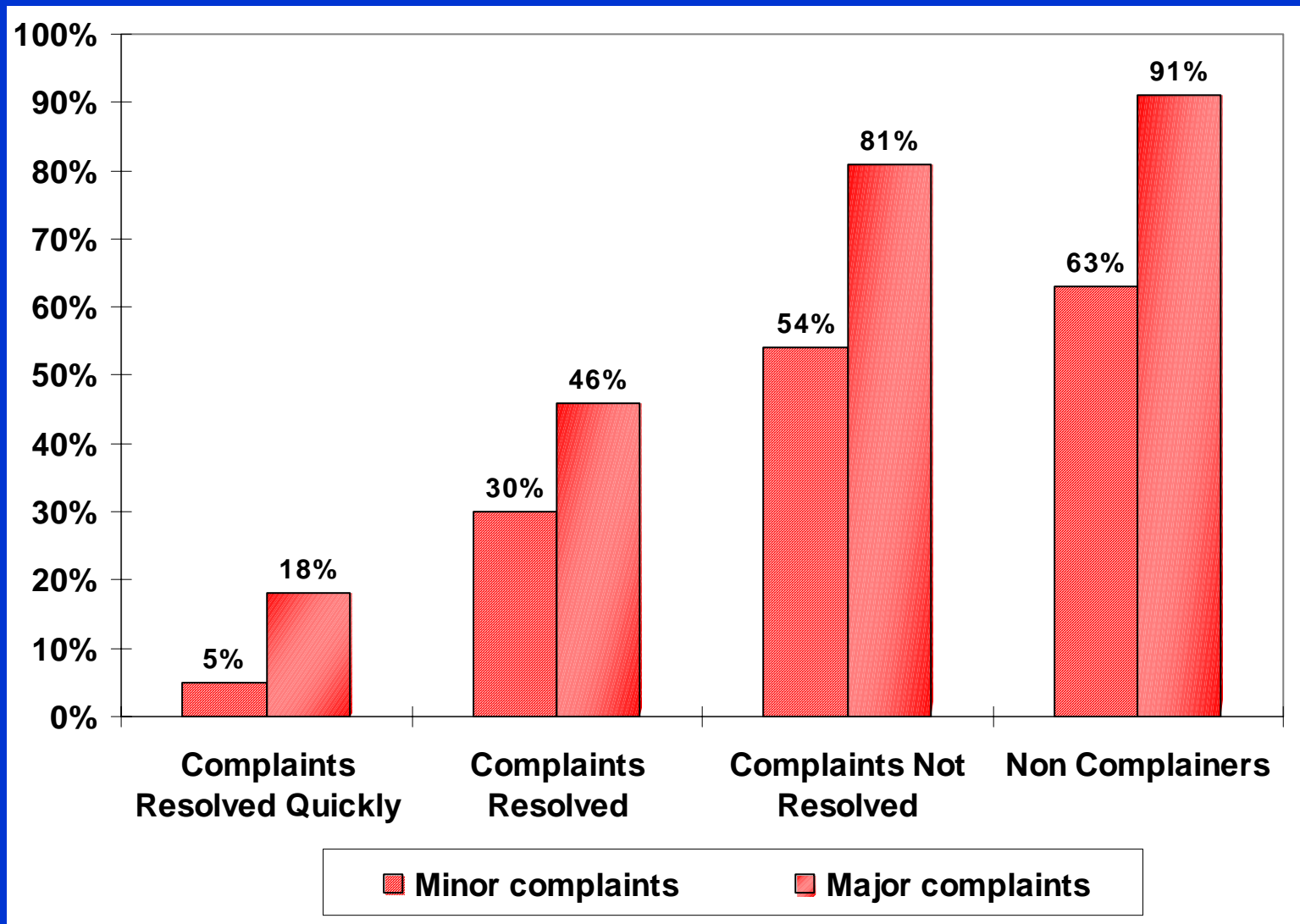
③ Savings

“In 1998, 74% of all IT projects overran or failed, resulting in almost \$100 billion in unexpected costs.”

The Standish Group, Based on a 1998 survey of over 7,000 IT projects



HOW MANY OF YOUR CUSTOMERS WITH A COMPLAINT WILL *NOT* BUY FROM YOU AGAIN?

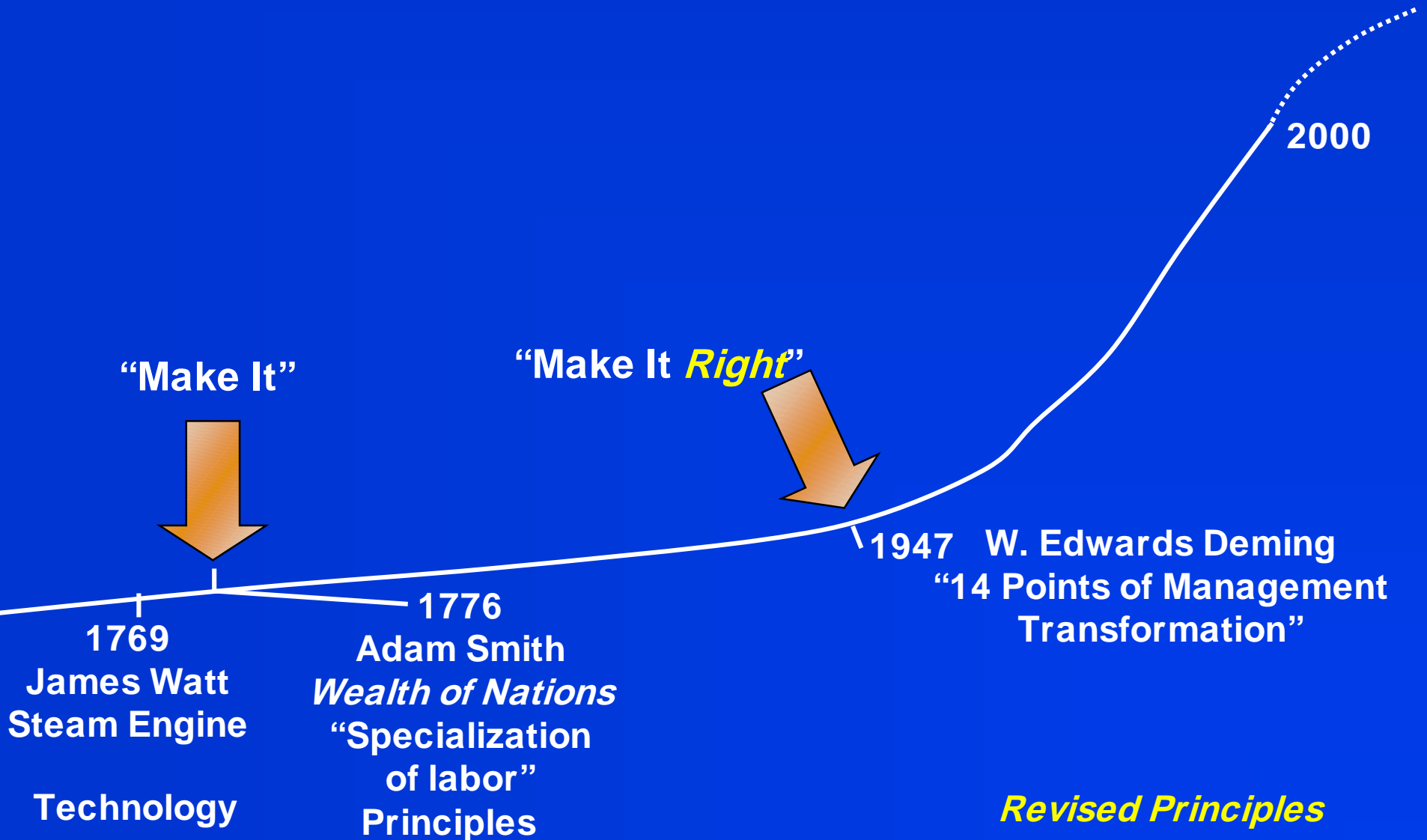


- Only 4% of customers with a complaint will tell you
- People with complaints will tell 8-10 other people

Source: TARP

INDUSTRIAL AGE MATURITY

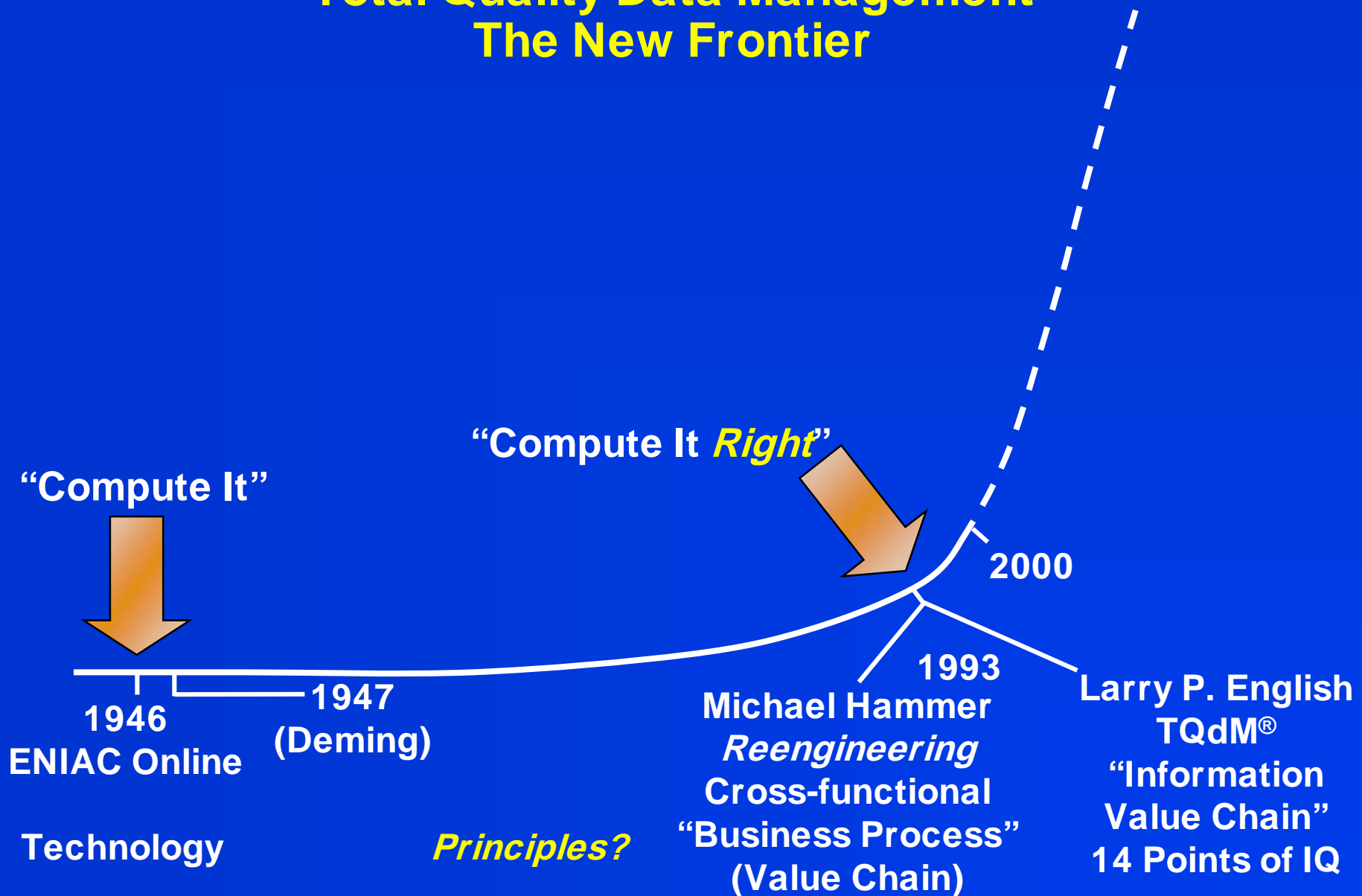
Total Quality Management



INFORMATION AGE MATURITY

Total Quality Data Management

The New Frontier



INFORMATION QUALITY

**“Consistently
meeting
knowledge worker and end-customer
expectations”
through information and information services**

Larry English, TQdM®

Quality of:

- **Data Definition (*all* business metadata)**
- **Data Content**
- **Data Presentation**

QUALITY PRINCIPLES

Customer focus

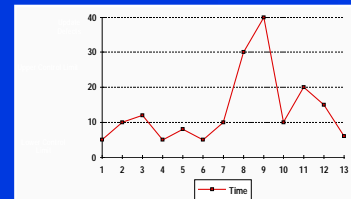
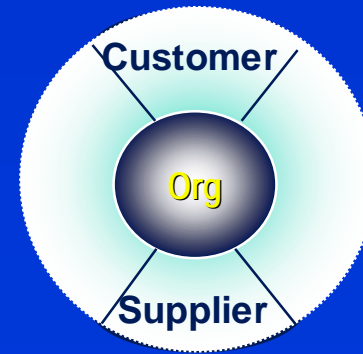
- Market focus
- Customer satisfaction
- Partnership

Process improvement

- Process definition
- Product specification (customer)
- Team work
- Continuous process improvement (CPI) and 6 Sigma
- Business process re-engineering (BPR)

Scientific methods

- Statistical quality control
- PDCA (Shewhart cycle)



KAIZEN® : THE ART OF CONTINUOUS IMPROVEMENT

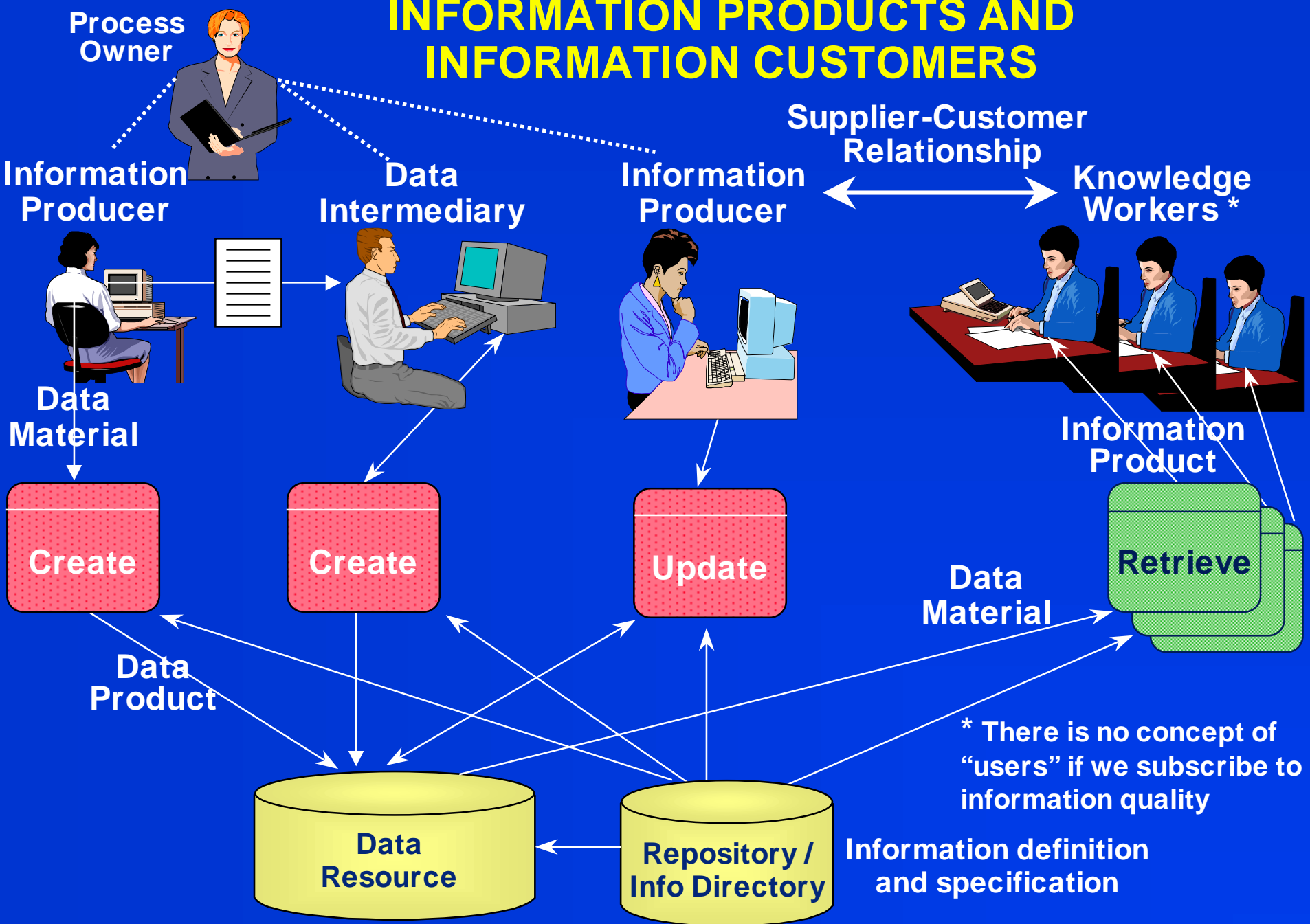
“Kaizen® simply means continuous improvement involving everybody in the organization. I think the two key words, one is improvement and the other is continuous. And it is possible for people to make improvement once, but to keep people making improvements year after year is another challenge”

Masaaki Imai, Founder, Kaizen Institute

- ❑ **Kaizen objectives: To continually improve everything in the business by encouraging everybody to take responsibility for the process**

Kaizen is a registered trademark of the Kaizen Institute

INFORMATION PRODUCTS AND INFORMATION CUSTOMERS



2. Assessing Information Quality



“You cannot measure what is not defined.”

Paul Strassman, *Information Payoff*

“One accurate measurement is worth a thousand expert opinions”

Grace Hopper (1906-1992), Admiral, U.S. Navy

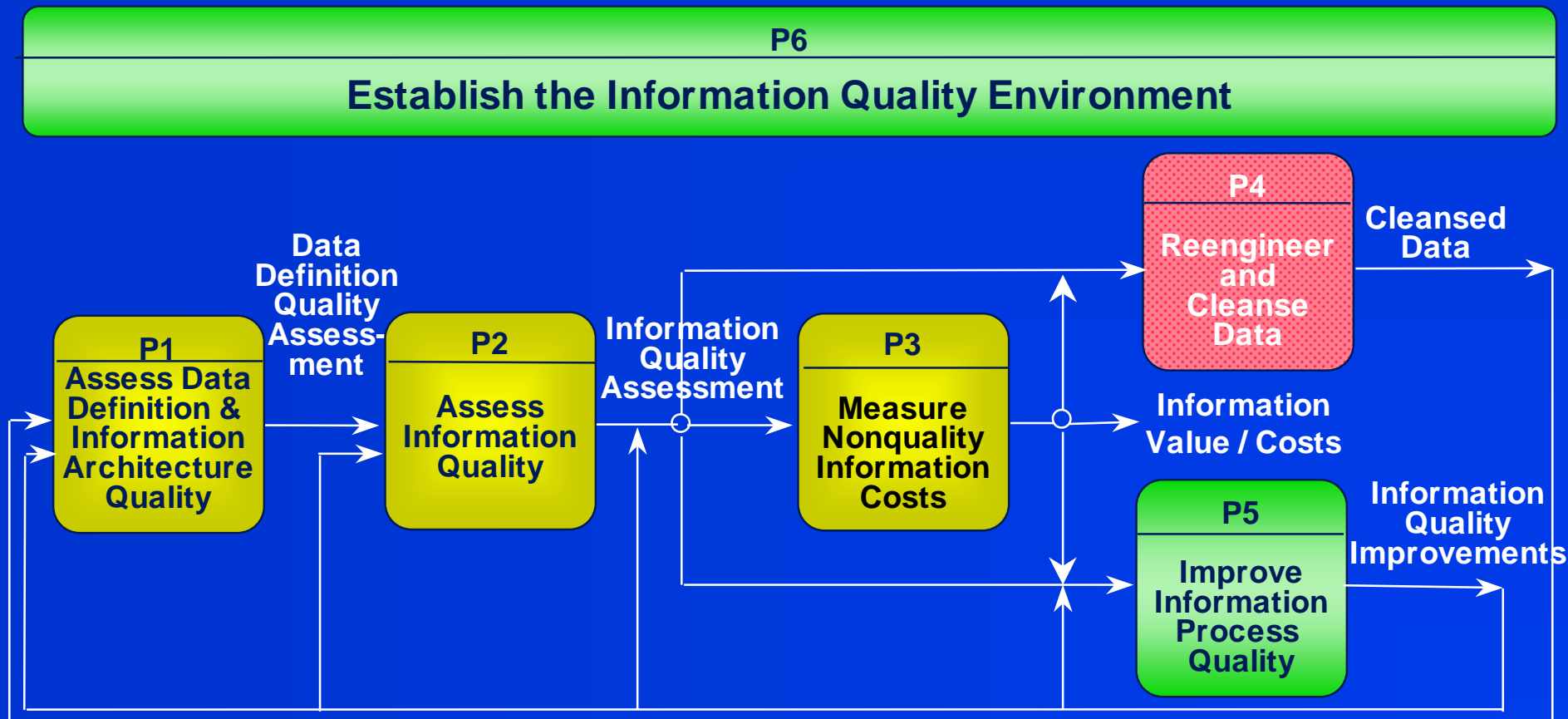
TOTAL QUALITY data MANAGEMENT (TQdM®)

Methodology Overview

TQdM® is *not* a program; rather, continuous improvement of:

1. *Application and data development processes*
2. *Business processes*

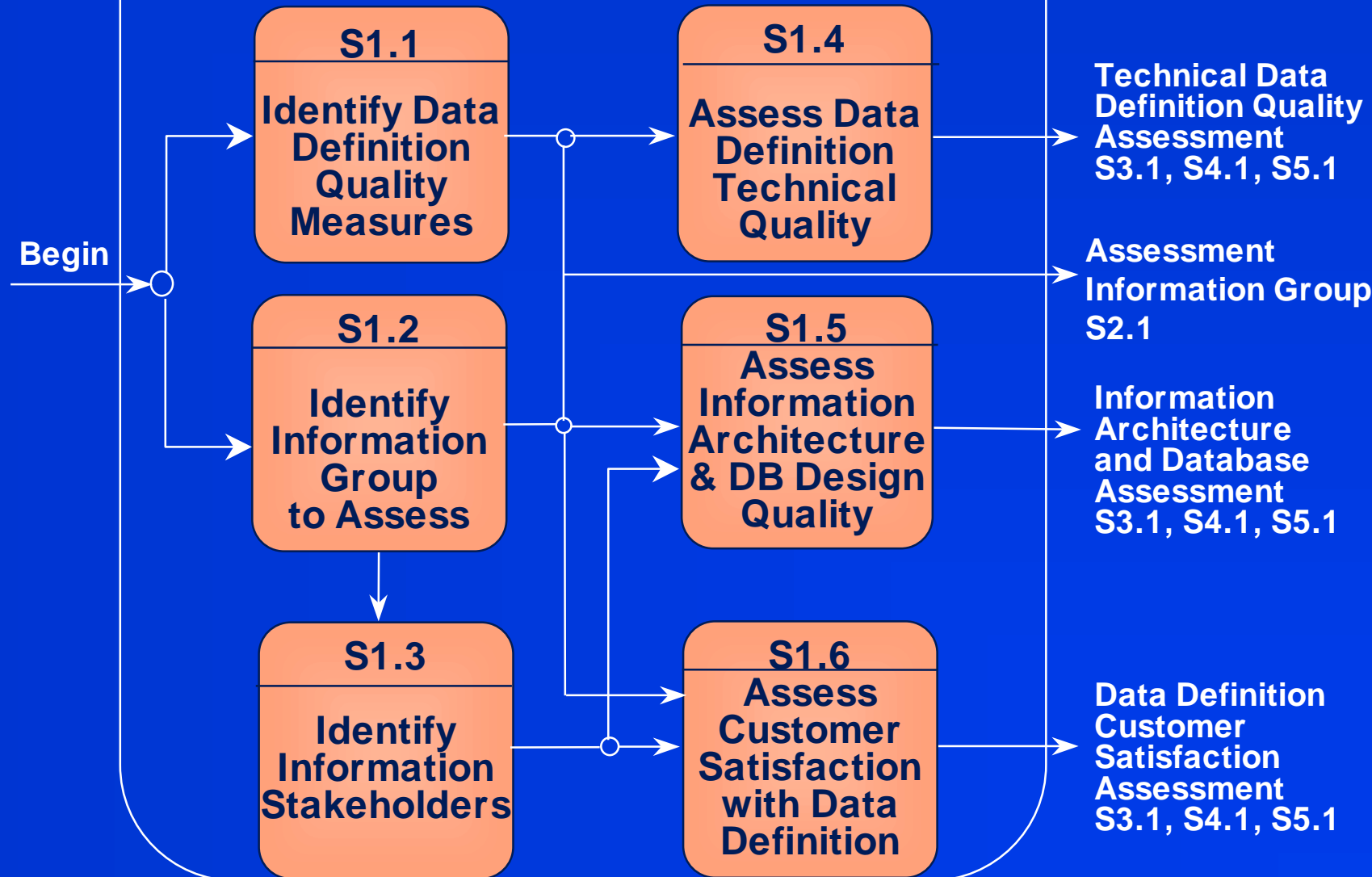
By integrating *quality* management *beliefs, principles* and *methods* into the *culture*



TQdM® METHODOLOGY

PROCESS P1:

Assess Data Definition and Information Architecture Quality



DATA DEFINITION QUALITY MEASURES

Meaningful enterprise data standards / guidelines

- ❑ Conformance to *meaningful* enterprise standards
- ❑ Meaningful business names, terms and abbreviations
- ❑ Consistency of data names
- ❑ Clear, precise, complete, consensus definition
- ❑ Singularity of definition
- ❑ Complete, exact definition of domain values
- ❑ Completeness, correctness and usefulness of business rules

Understandable to knowledge workers and information producers using customer satisfaction surveys

ATTRIBUTE DEFINITION QUALITY CHECKLIST

- ☐ The definition describes a *specific kind of fact* that can be used to add value to the enterprise
- ☐ The description of *only one* type of fact
- ☐ The attribute is an *inherent* characteristic of the entity type
- ☐ The business terms, entity names, or other attribute names used in the definition have already been defined
- ☐ The description of *one and only* one entity type or subtype
- ☐ The illustration of example values
- ☐ A value of the attribute is complete and unambiguous
- ☐ The attribute values are mutually exclusive
- ☐ A derived attribute definition describes the formula or calculation
- ☐ In an attribute is derived, all base attributes from which it is calculated are named and defined

A COMPLETE SET OF DATA DEFINITION QUALITY Checklists

- ❑ For more information on how to create and assure high quality data definitions and information architecture, see *Improving Data Warehouse and Business Information Quality*, Chapter 5: “Assessing Data Definition and Information Architecture Quality,” pages 83-136
- ❑ The chapter contains 22 checklists for data definition and information architecture quality including:
 - Data standards quality
 - Entity type name, attribute name and domain consistency
 - Abbreviation and acronym clarity
 - Business term, entity type, attribute and domain definition quality
 - Business rule quality
 - Entity to entity, attribute to entity, type subtype and entity life cycle relationship quality
 - High level business information model, operational data model, operational database, distributed database and data warehouse model quality

INFORMATION PRODUCT CUSTOMER SATISFACTION SURVEY

☐ I have access to all the data I need to do my job effectively and efficiently

(Rate on a scale of 1-10: 1 = not at all / poor: 10 = excellent)

Rating

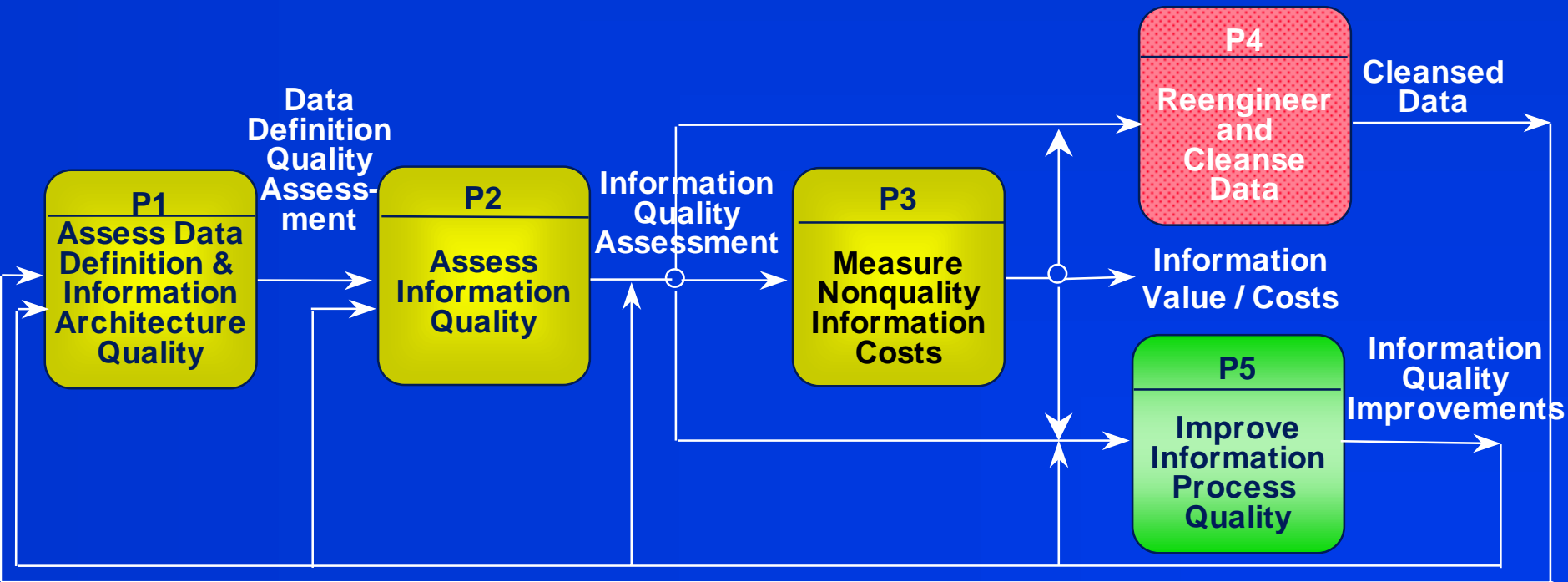
- ___1. I can get (or access) the data *directly*
- ___2. I get the data *when* I need it
- ___3. The data values for the data I get (or access) are *complete*
- ___4. The data is *correct* and *trustable* (I *rarely* get data that is inaccurate or whose accuracy is questionable)
- ___5. There are no additional data elements (facts) I need that are missing or that I cannot get
- ___6. The data is in an easily useable and understandable format
- ___7. The meaning of the data is clear to me
- ___8. The data enables me to be more *efficient*
- ___9. The data enables me to be more *effective*
- ___10. The data presented in a way that is easy to use
- ___11. What would help me do my job better is... _____

TOTAL QUALITY data MANAGEMENT (TQdM®)

Methodology Overview

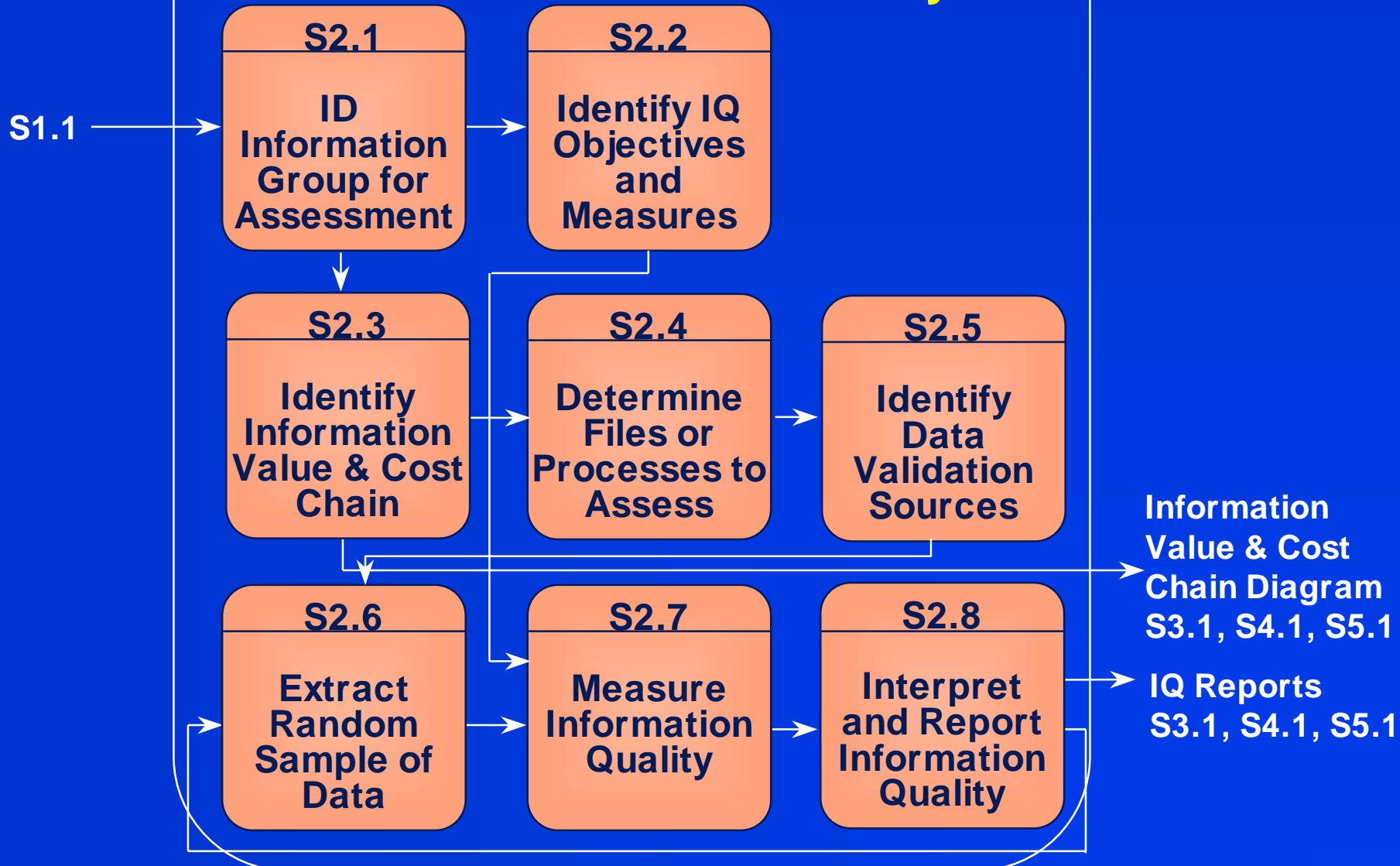
P6

Establish the Information Quality Environment



TQdM® METHODOLOGY

PROCESS P2: Assess Information Quality

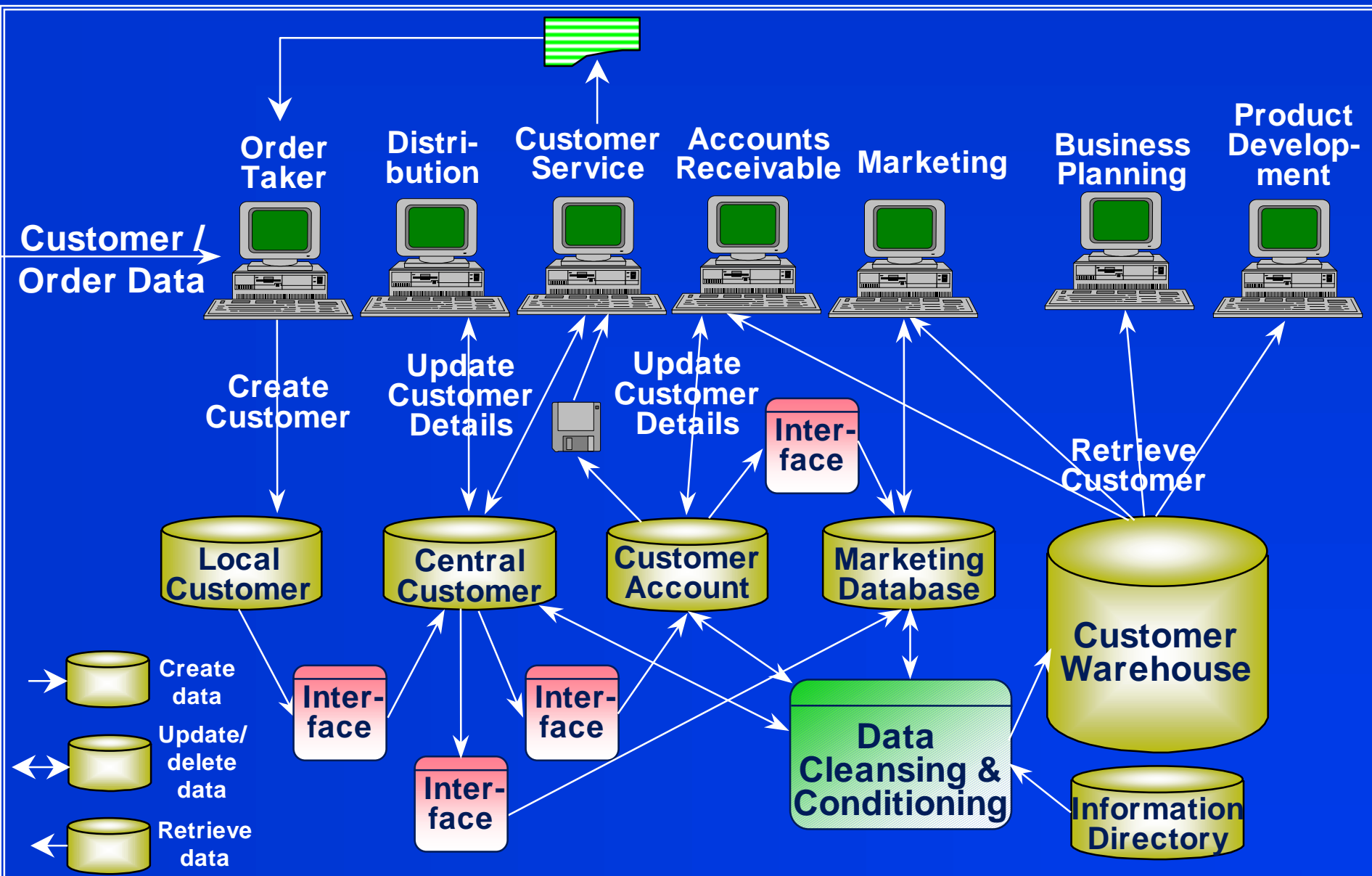


DATA CONTENT QUALITY MEASURES

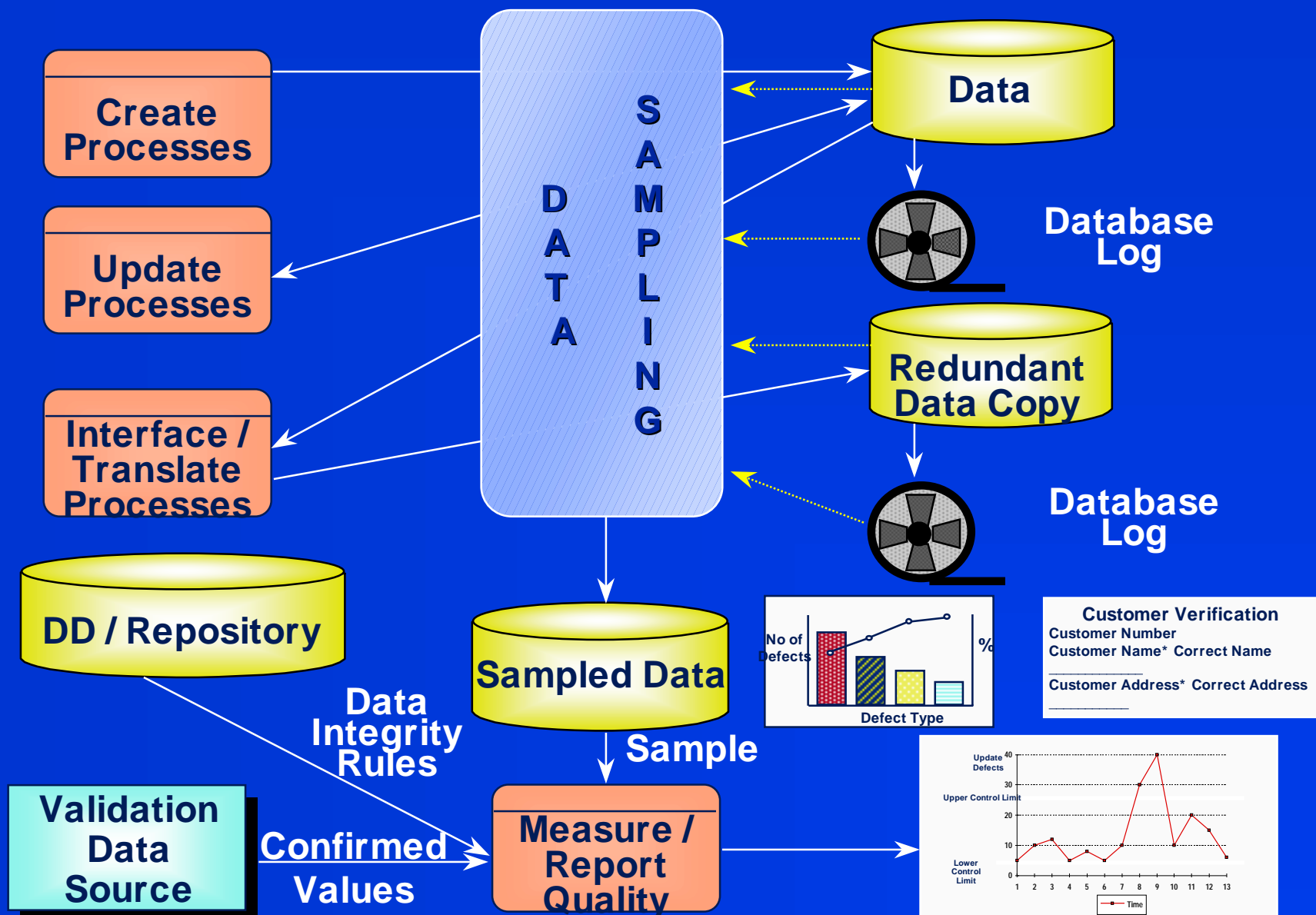
- ❑ ***Completeness*** of data: both ***kind*** of data and ***values***
- ❑ ***Validity*** of data as to conformance to business rules
- ❑ ***Accuracy*** of data as measured by a physical data assessment of a random sample
- ❑ ***Precision*** of data values
- ❑ ***Non-duplication*** of occurrences
- ❑ ***Consistency*** of replicated, distributed, redundantly maintained or derived data
- ❑ ***Timeliness*** of data for knowledge worker use
- ❑ ***Rightness*** of the data as measured by customer satisfaction surveys of knowledge workers and information customer “retention”

INFORMATION VALUE / COST CHAIN

Customer



DATA MEASUREMENT AND ASSESSMENT SYSTEM Components



THE INFORMATION ASSESSMENT

- ❑ Conduct automated assessments for *conformance to* business rules
 - Measure completeness
 - Measure *validity* (domain values, ranges, derived data)
 - Identify suspect data
 - Identify potential duplicate records
- ❑ Conduct physical assessments for data *accuracy*
 - Compare data to data validation source
 - Confirm potential duplicate records
- ❑ Verify consistency across all copies
- ❑ Interpret and communicate results
- ❑ Track over time to communicate progress
- ⇒ Audit without accountability is inspection only

MEASURING INFORMATION QUALITY

Example

- Customer file has 250,000 records
- Customer file data group A (highest quality standard) has 13 fields
- Random sample of 50 records selected
- Error opportunity: $13 \times 50 = \underline{650}$
- 22 errors in 10 of the 50 records
- Record** error percent: $10 \div 50 = \underline{20\%}$
- Field B** error percent: $3 \div 50 = \underline{6.0\%}$
- Total** error percent = $22 \div 650 = \underline{3.4\%}$
- EPM*: $3.4\% \times 1,000,000 = \underline{34,000}$

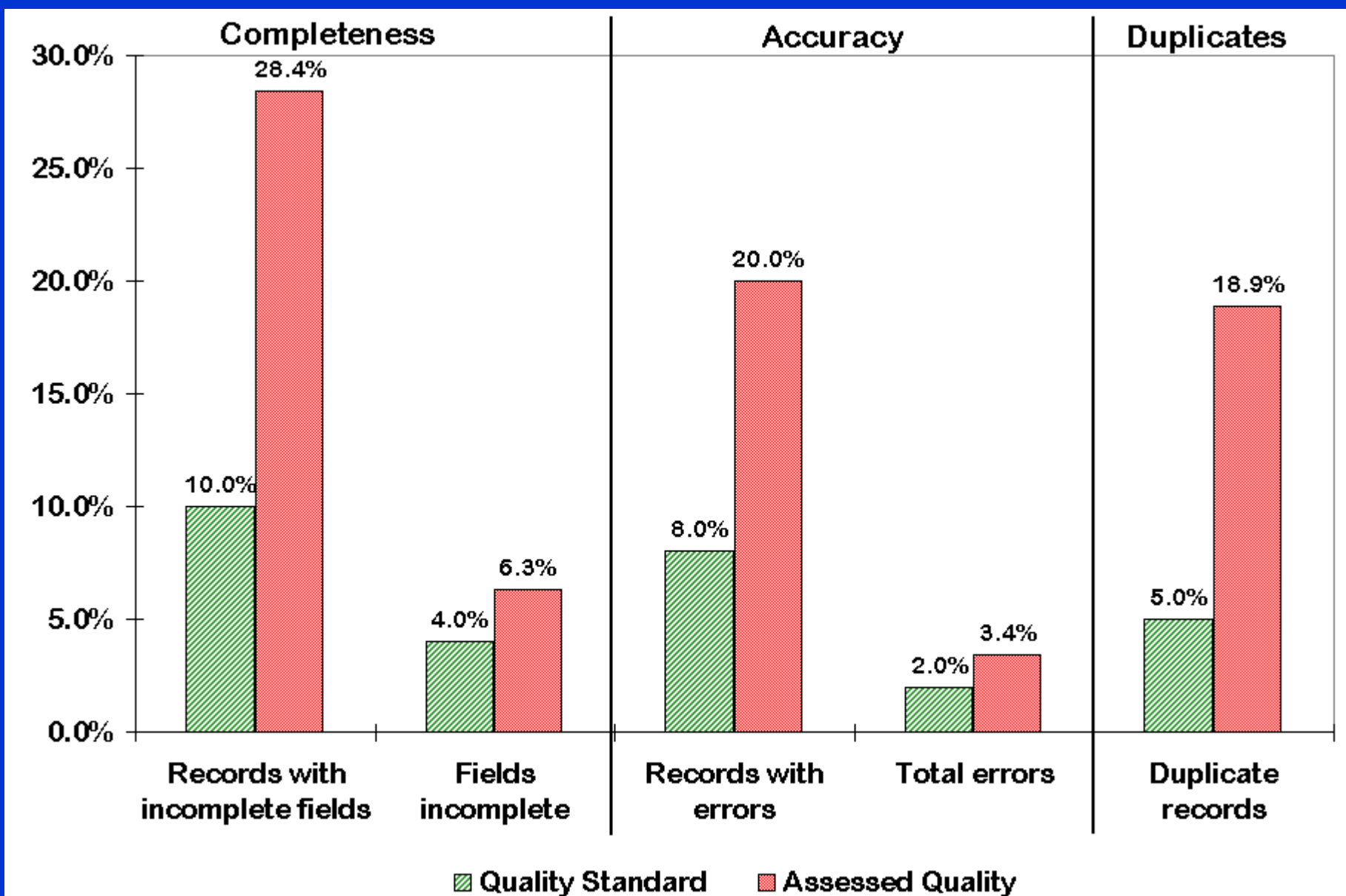
Customer Data Sample

	A	B	C	D	E	F	G	H	I	K	L	M	N
1													
2													
3													
4													
5													
6													
7													
8													
9													
10													
11													
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* EPM = Errors per million

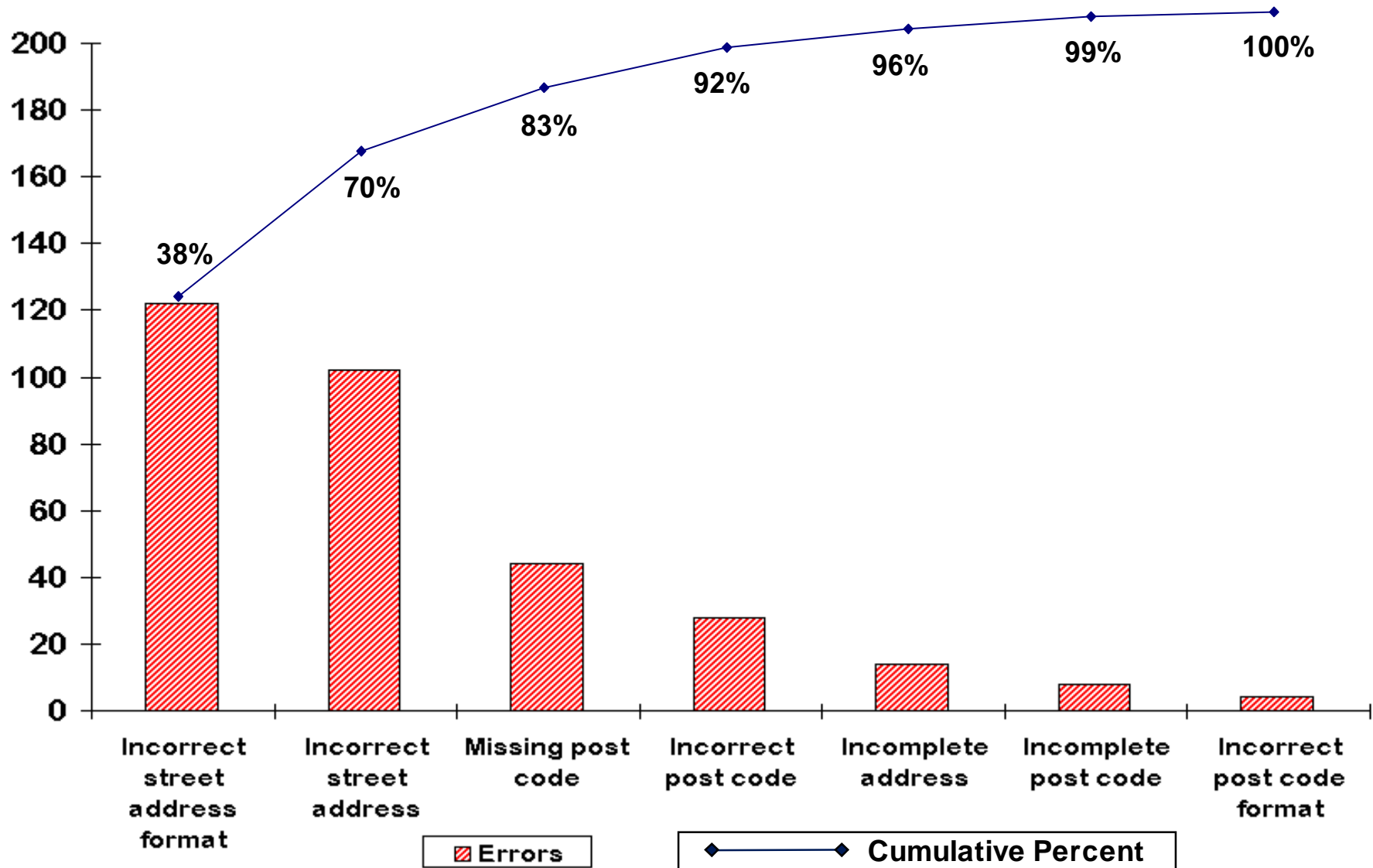
INFORMATION QUALITY SUMMARY REPORT

Reference Customer Database



PARETO DIAGRAM

Address Errors By Type



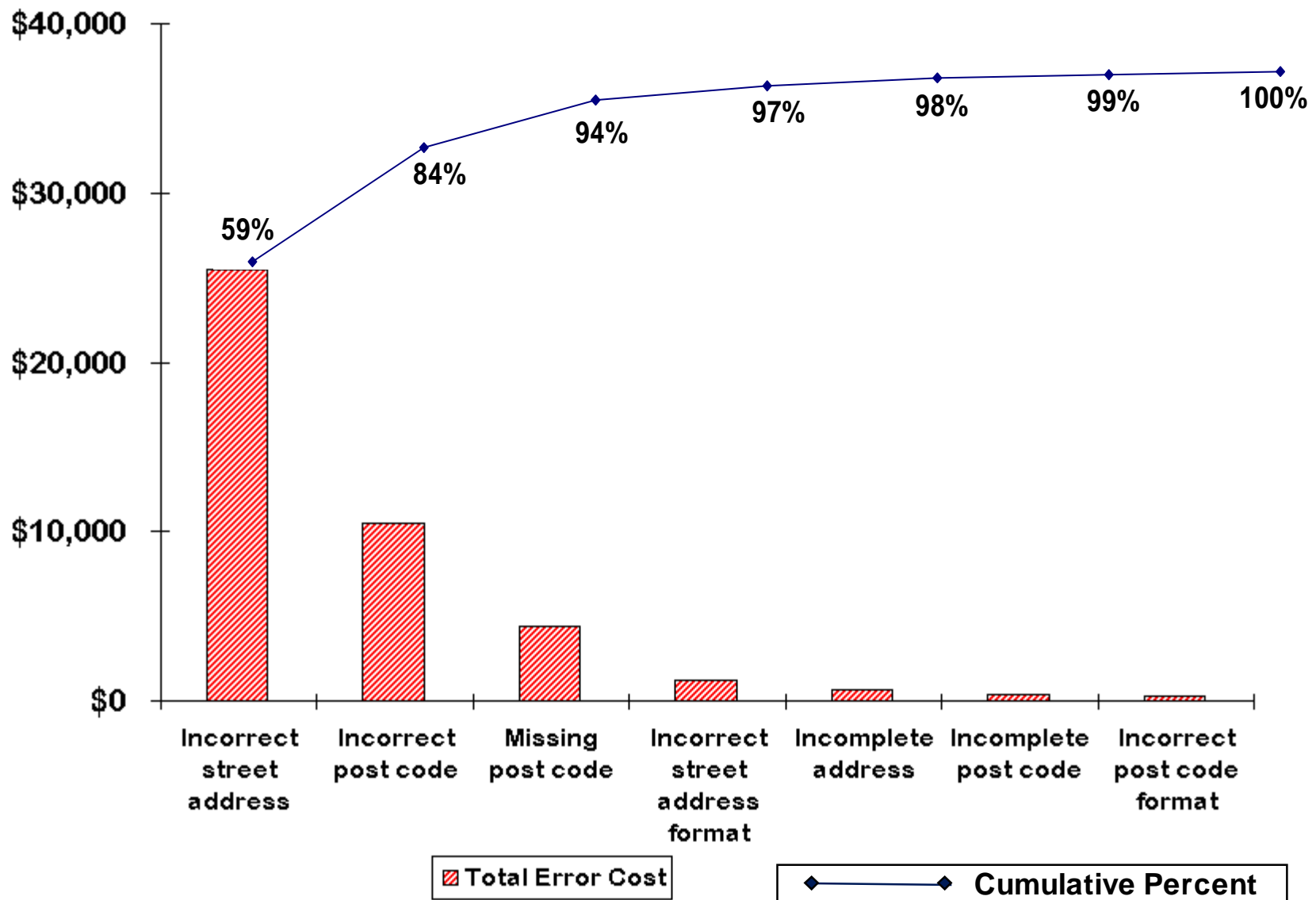
WEIGHTING ERRORS

A	B	C	D	E	F
Error Count	Error Weight Cost/yr	Weighted Result	Error Type	Total Error Cost/yr	Sample Percent of Population
61	\$0.20	\$12.20	Incorrect street address format	\$1,220	1%
51	\$5.00	\$255.00	Incorrect street address	\$25,500	1%
22	\$2.00	\$44.00	Missing post code	\$4,400	1%
14	\$7.50	\$105.00	Incorrect post code	\$10,500	1%
7	\$1.00	\$7.00	Incomplete address	\$700	1%
4	\$1.00	\$4.00	Incomplete post code	\$400	1%
3	\$1.00	\$3.00	Incorrect post code format	\$300	1%
162				\$43,020	Total
		(A x B)		(C ÷ F)	

- ❑ Not all errors are equally “bad”
- ❑ Identify relative impact or “cost” of each error during a given period of time, e.g., quarterly or yearly
- ❑ Determine relative percent of the total population
- ❑ Multiply the number of errors times the weight and divide by the sample percent of total population

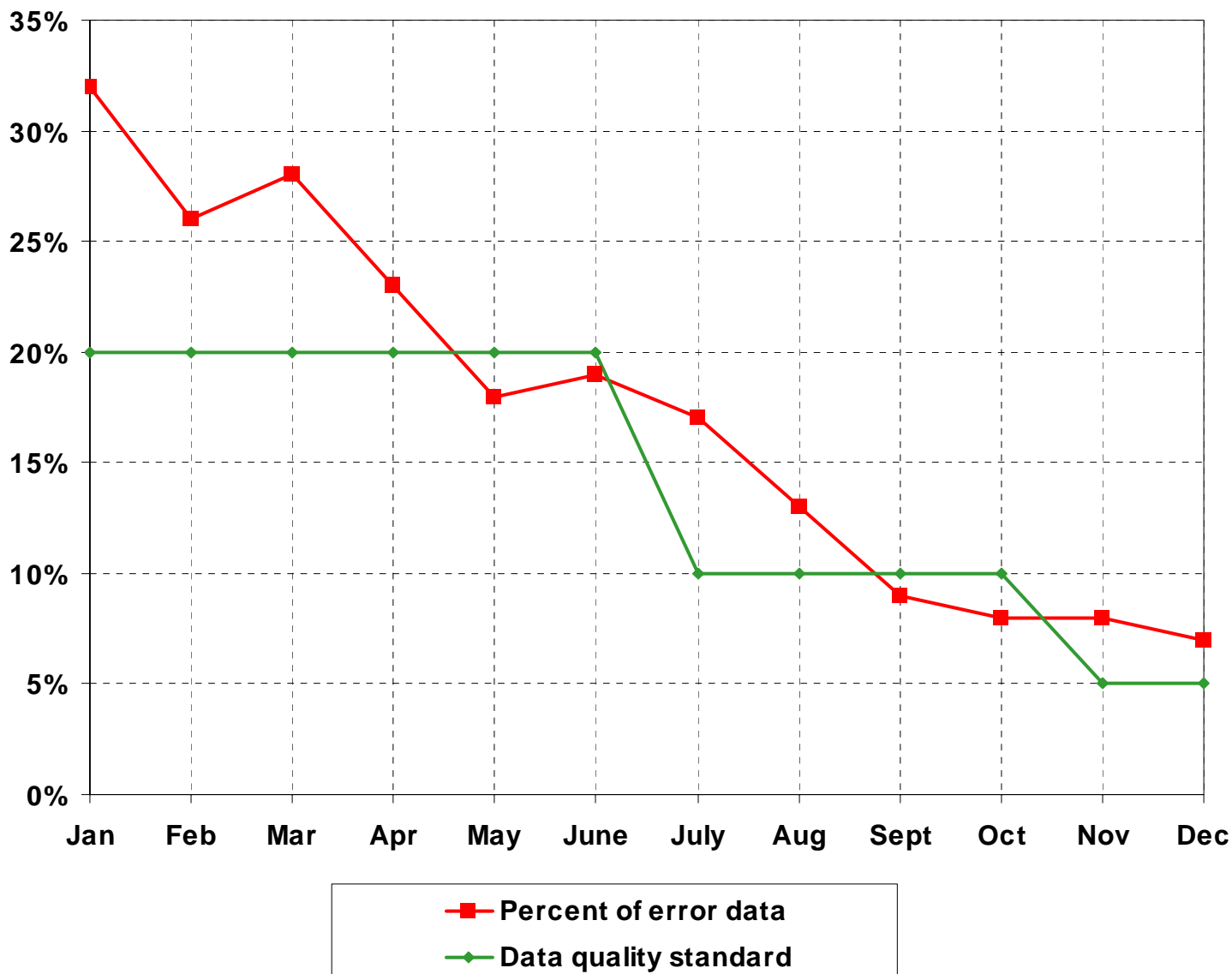
WEIGHTED PARETO DIAGRAM

Address Error Impact

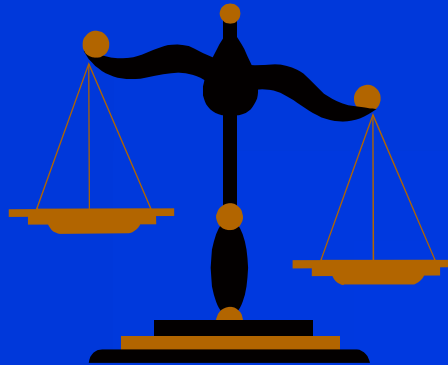


INFORMATION QUALITY CONTROL CHART

Customer Data



3. Quantifying Non-Quality Information Costs



“Go slow so you can go fast.”

Japanese saying

“The bitterness of poor quality remains long after the sweetness of low price is forgotten.”

Etienne C. M. van Waes, Dow Chemical

Improving Data Warehouse and Business Information Quality, Chapter 7, pp 199 - 235

COSTS OF NONQUALITY DATA

- ❑ Costs of nonquality information (process failure and scrap and rework)
- ❑ “Losses” measured in customer lifetime value
- ❑ Mission failure

NON-QUALITY DATA COST COMPONENTS

- ❑ Time
 - Business personnel
 - I / S personnel
- ❑ Money
 - Direct payments and credits
 - Fines
 - Future revenue lost / missed
- ❑ Materials
 - Raw materials consumed
 - Products scrapped
 - Supply / support materials consumed
- ❑ Facilities and Equipment
 - Space requirements
 - Equipment
- ❑ Computing resources
 - CPU cycles
 - Network / communication
 - Data storage

NON-QUALITY INFORMATION COSTS

Direct Costs

Marketing Campaign	Per Instance	Number Instances	Total Number Per Year	Total cost per year
* Time: (\$60/ hour loaded rate)				
- Creating redundant occurrences	2.4 min	167,141	1	\$401,138
- Researching correct address	10 min	5,000/mo	12	\$600,000
- Correcting address errors	0.3 min	6,000/mo	12	\$21,600
- Handling complaints from customers	5.5 min	974/yr	1	\$5,357
- Mail preparation	0.1 min	393,273	4	\$157,309
* Money				
- Credits to customers	--	--	--	--
- Fines	--	--	--	--
* Materials				
- Marketing brochure	\$1.96	393,273	4	\$3,083,260
- Postage	\$0.52	393,273	4	\$818,008
* Facilities and Equipment				
- Warehouse storage	\$0.01	393,273	4	\$15,731
- Shipping equipment maintenance	\$5,000/yr	36.0%	1	\$1,800
* Computing resource				
- CPU transactions	\$0.02/trans	393,273	4	\$31,462
- Network	--			
- Data storage	\$0.001/mo	393,273	12	\$4,719
- Data backup	\$0.005/mo	393,273	12	\$23,596
Total Annual Costs				\$5,163,980

NON-QUALITY INFORMATION COSTS

Missed Opportunity Costs

Information Value	
Catalogs mailed	1,092,431
- Duplicate addresses (15.3%)	167,142
- Wrong/missing address (20.7%)	226,131
- Total catalogs "scrapped"	393,273
- Costs per catalog	\$2.61
Non-recoverable costs	\$1,026,443
Response rate of target customers	1.5%
Response rate of "missed" prospects	0.4%
Missed customer opportunity rate	1.1%
Misdirected catalogs	226,131
Missed first time customers	2,487
Customer lifetime value	\$1,518
Missed customer lifetime value	\$3,775,266

NON-QUALITY INFORMATION COSTS

Lost Opportunity Costs

<i>Opportunity</i>	<i>Formula</i>	<i>Per Year</i>
Total Customer Complaints		974
Customer complaints with IQ problems	49.5%	482
Ratio of complaints to “non-complaints”	1 : 26 (retail avg)	
Non-complainers with complaints	482 x 26	<u>12,532</u>
Total customers with complaints		13,014
Complainer attrition (of 482)	40%	193
Non-complainer attrition (of 12,532)	75%	<u>9,399</u>
Total lost customers		9,592
Customer lifetime value		<u>\$1,518</u>
Opportunity Costs due to IQ problems		\$14,560,656

4. Improving Information *Product* Quality



“After the first four years, the dirt doesn’t get any worse.”

Quentin Crisp, *The Naked Civil Servant*

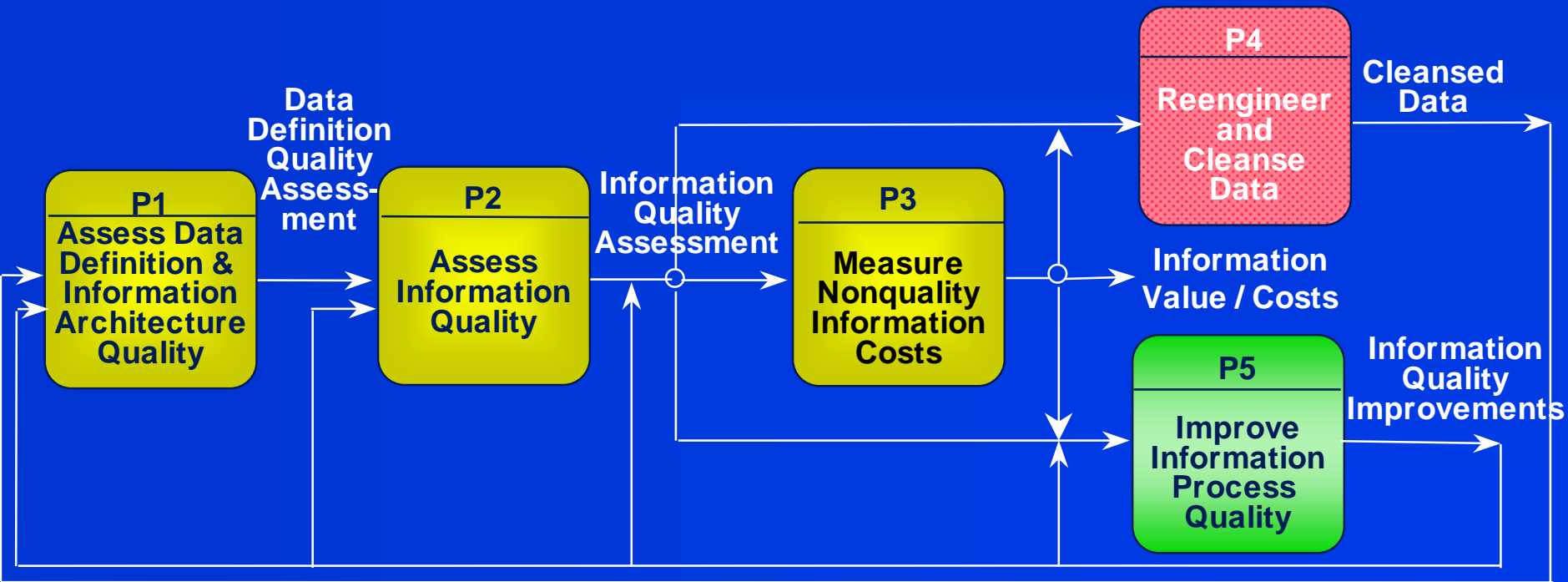
Improving Data Warehouse and Business Information Quality, Chapter 8, pp237-282

TOTAL QUALITY data MANAGEMENT (TQdM®)

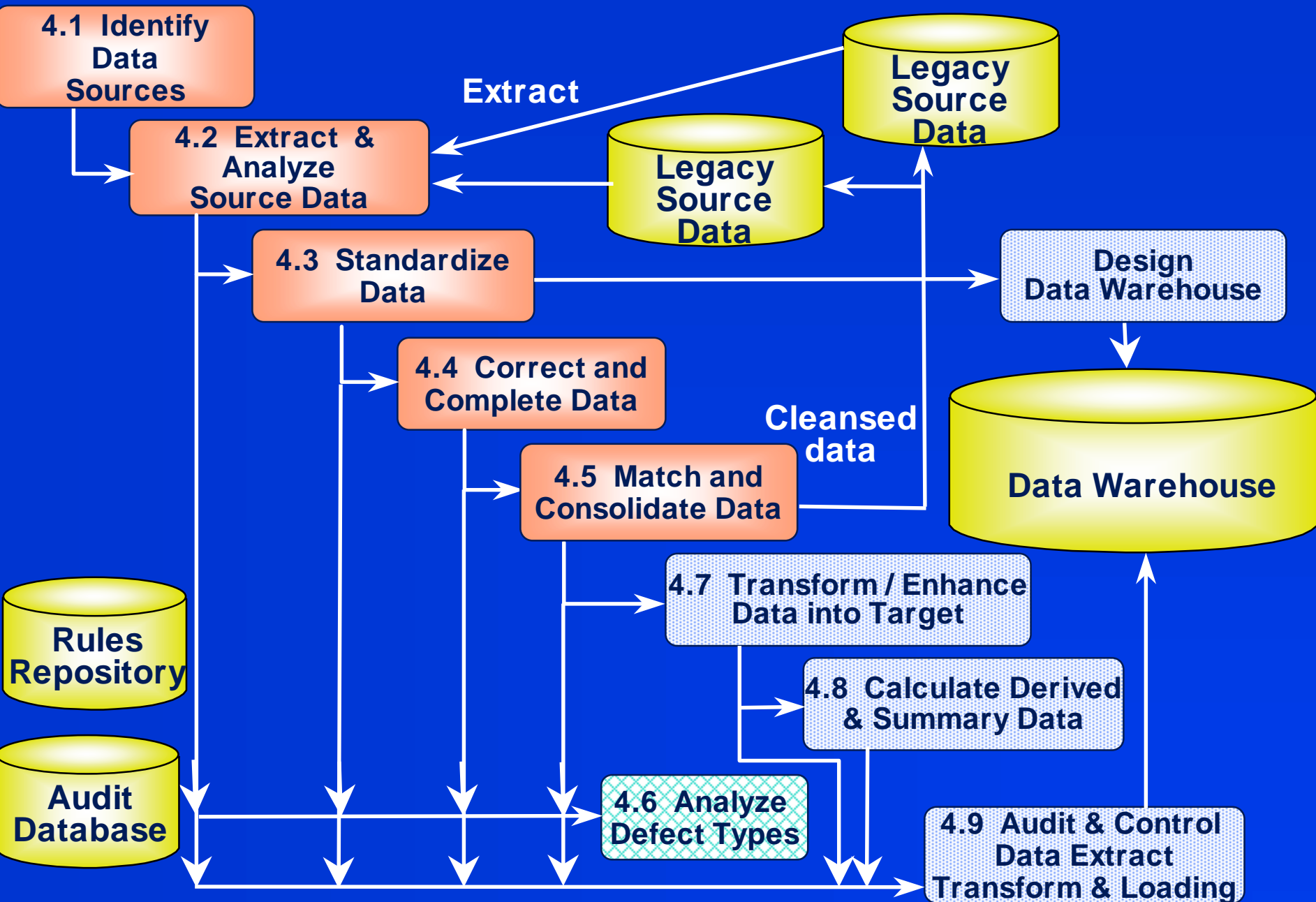
Methodology Overview

P6

Establish the Information Quality Environment



DATA REENGINEERING / CLEANSING PROCESS



INFORMATION QUALITY IN THE DATA WAREHOUSE

- ❑ Solves *strategic business* problems
- ❑ Think and plan big, start small, incremental
- ❑ Analyze legacy data to discover “*hidden*” data
- ❑ *Enterprise consensus* data models and definitions
- ❑ Business information stewards validate data definition
- ❑ Information directory / data definition availability
- ❑ Data quality measured and corrected at the source
 - If *not* correctable, measure and post its quality
- ❑ Data assessments used to correct data defect *cause*
- ❑ Changed performance measures and incentives
- ❑ Data managed at the source and detail level
- ❑ Highly automated and controlled ECTL processes
- ❑ Regular customer satisfaction surveys
- ➡ Data model and definitions *re-used* for reengineering

5. Improving Information *Process* Quality



“It is a funny thing about life; if you refuse to accept anything but the best, you very often get it.”
Somerset Maugham, English novelist & dramatist

“There is absolutely no reason for having errors or defects in any product or service.”
P. B. Crosby

“Measure twice, cut once.”
Carpenter’s Rule of Thumb

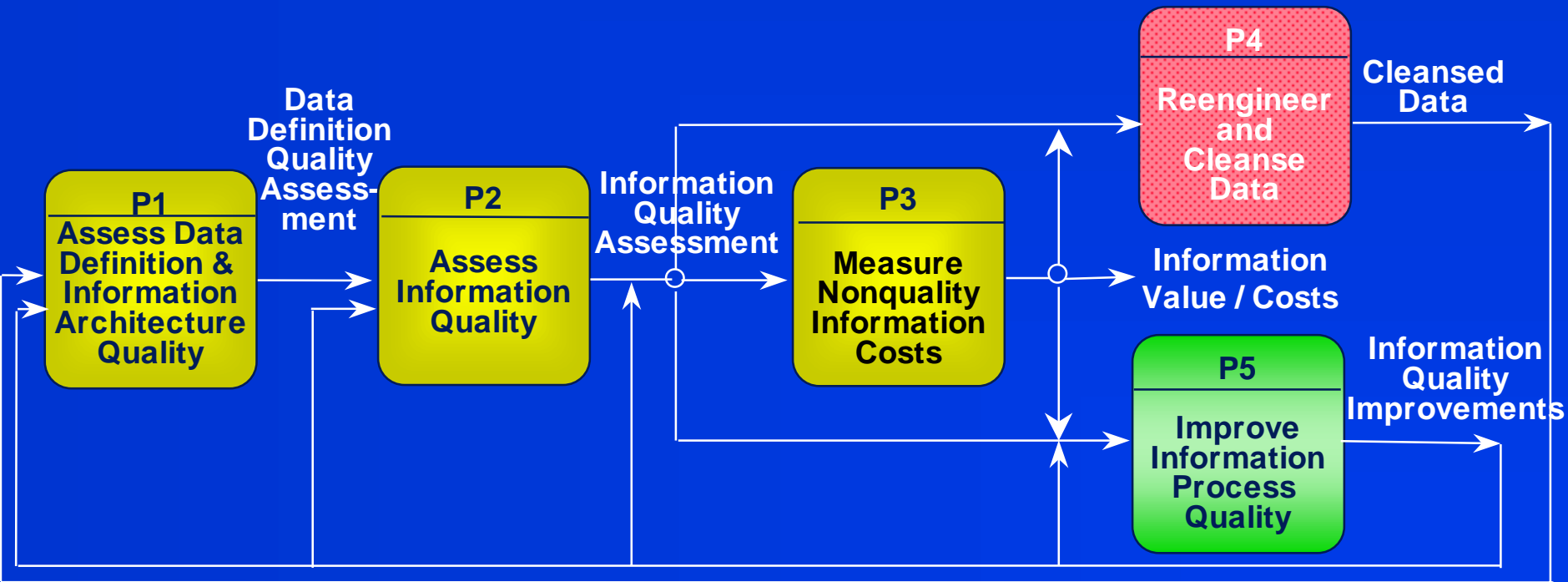
Improving Data Warehouse and Business Information Quality, Chapter 9, pp285-310

TOTAL QUALITY data MANAGEMENT (TQdM®)

Methodology Overview

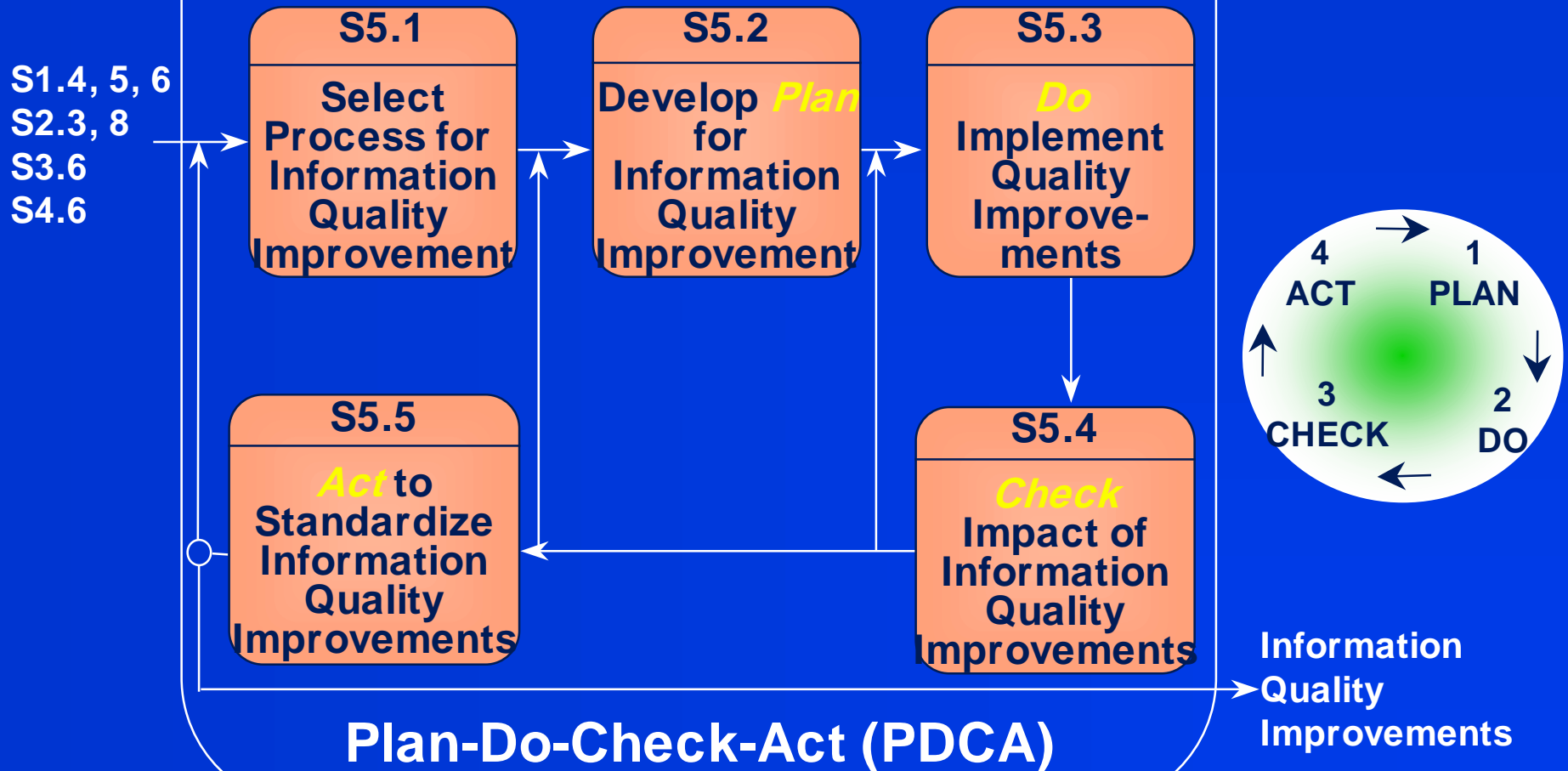
P6

Establish the Information Quality Environment



TQdM® METHODOLOGY

PROCESS P5: Improve Information Process Quality



CAUSE-AND-EFFECT DIAGRAM

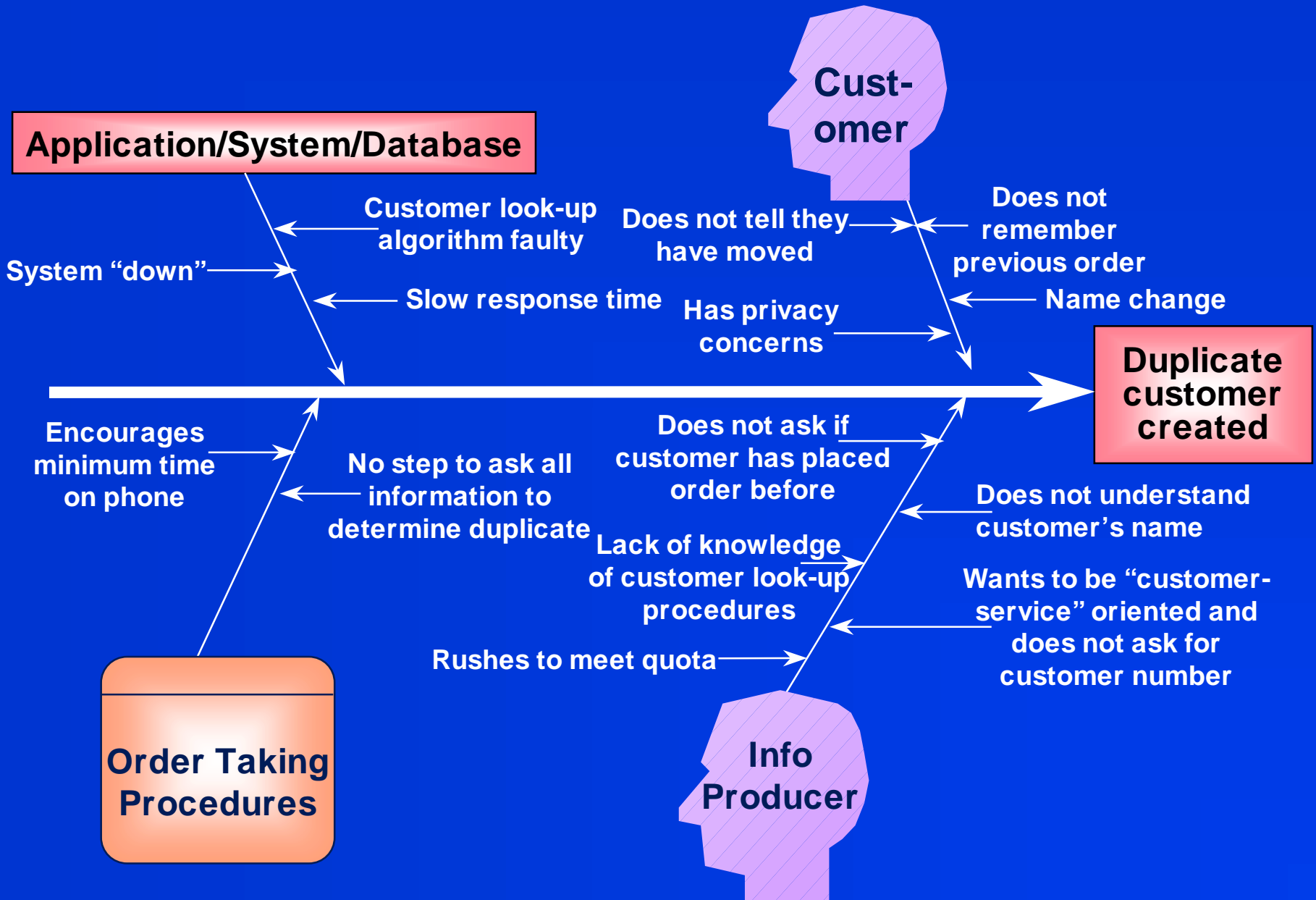
Principles

- ⇒ Solution-focused, non-blame, non-judgmental atmosphere
- ⇒ Defective data means the *process* is broken, not the *people*
- ❑ Describe the effect clearly
- ❑ Everyone must participate
- ❑ Do not criticize ideas or suggested causes
- ❑ Go for visibility, so all can see
- ❑ Group causes together as they are mentioned
- ❑ Do not overload a diagram
- ❑ Circle the most likely causes *after* all ideas listed
- ❑ Understand each cause
- ❑ Maintain diagrams

Source: *Kaizen*, BBC Training Videos

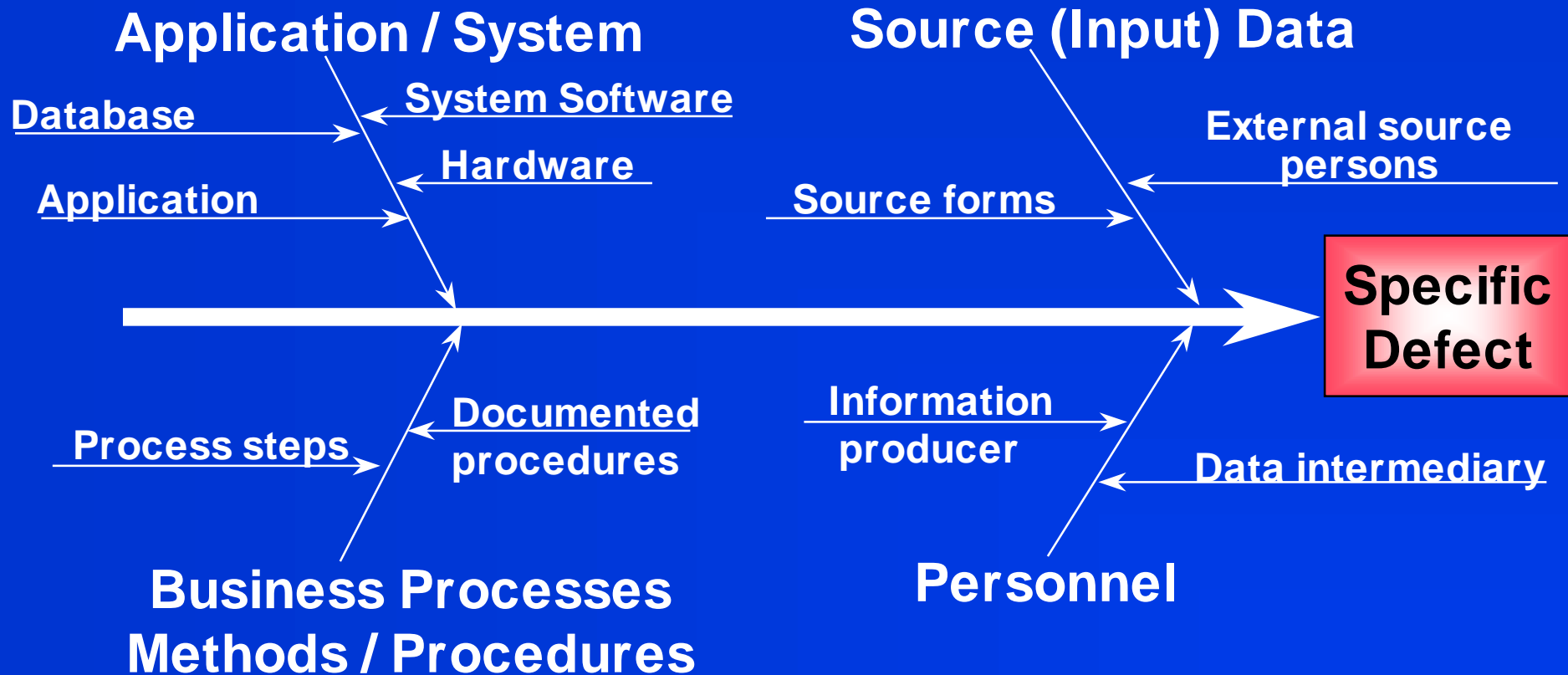
CAUSE-AND-EFFECT DIAGRAM

Order Entry Errors



CAUSE-AND-EFFECT DIAGRAM

For Information Quality (Business Process Quality)



6. Implementing and Sustaining an Information Quality Improvement Environment



“Success is a journey, not a destination”

“Quality is free. But it is not a gift” P. B. Crosby

Improving Data Warehouse and Business Information Quality, Chapter 13, pp 421 - 454

14 Points of TOTAL QUALITY data MANAGEMENT (1-4)

1. Create constancy of purpose for improvement of *information* product and service: The obligation to the knowledge worker never ceases
2. Adopt the new philosophy of quality *shared data* as a tool for business improvement: “Reliable shared information reduces costs”
 - This means a transformation of I / S and business management
3. Cease reliance on data and application inspections alone to achieve information quality: Design quality into data design and data production processes and establish management accountability
4. End the practice of developing applications on the basis of “on-time,” “within budget” measures alone and capturing data at the lowest cost: Develop single data creation programs as the authoritative source

* Adapted from Deming's 14 Points

14 Points of TOTAL QUALITY data MANAGEMENT (5-9)

- 5. Improve constantly and forever the process of application and data development and data production and service: Implement a plan-do-check-act process for information quality improvement**
- 6. Institute training on information quality for all employees, especially information producers**
- 7. Institute leadership for information quality: appoint a full-time information quality leader**
- 8. Drive out fear of data uncertainty or data correction: Implement incentive programs for finding / and correcting problem causes**
- 9. Break down barriers between business areas: information management and application development; IT and business; business area and business area units**

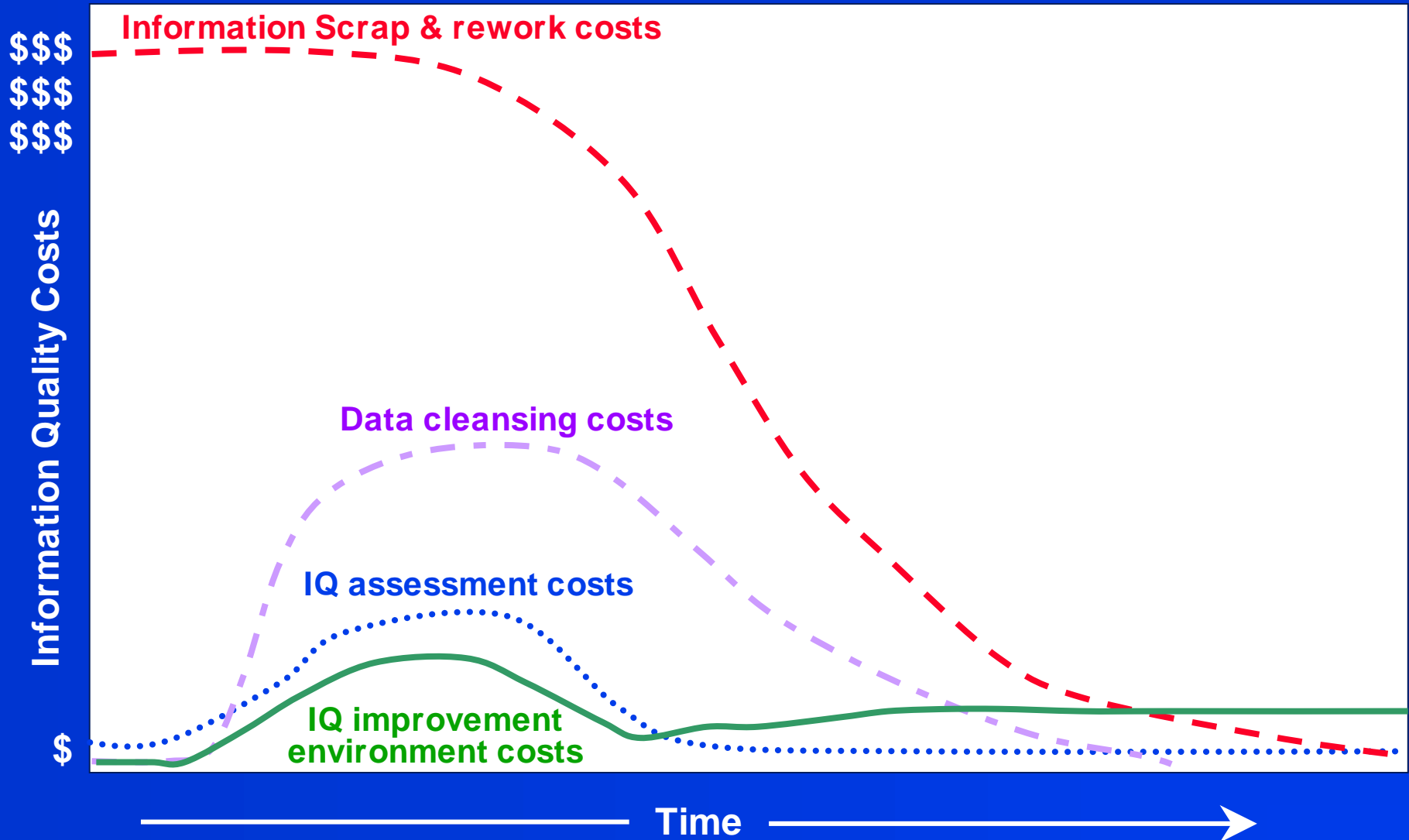
** Adapted from Deming's 14 Points*

14 Points of TOTAL QUALITY data MANAGEMENT (10-14)

- 10. Eliminate slogans and exhortations, and replace with actions for information quality improvement: develop a habit of data “defect prevention”**
- 11. Eliminate quotas of “productivity” with quality metrics: Customer satisfaction of information products**
- 12. Remove barriers to pride of workmanship; allow information producers to fix the problems in the processes**
- 13. Encourage education and self-improvement for all people in the information value chain: understand the paradigm shift and learn tomorrow’s skills**
- 14. Take action to accomplish the transformation for information quality: Senior management must feel the pain of the status quo and must communicate to a critical mass of people the need for change**

** Adapted from Deming’s 14 Points*

INFORMATION MANAGEMENT MATURITY AND COSTS OF QUALITY



HOW TO START A TQdM® PROGRAM

- ❑ Revisit / revise the information management mission
- ❑ Identify and empower an information quality leader
- ❑ Conduct a “customer” survey
- ❑ Set up an IQ problem “hotline” and broadcast
- ❑ Develop *inventory* and *value* chain of select critical data
- ❑ Conduct quality assessment of select critical data
- ❑ Analyze customer complaints with information problems
- ❑ Quantify the costs of nonquality data
- ❑ Develop rapport and support of change sponsor
- ❑ Get information producers and knowledge workers together
- ❑ Conduct a pilot information quality improvement project: measure and communicate benefits
- ❑ Provide education to all information stakeholders

EPILOGUE

“Quality is free. It’s not a gift, but it is free. What costs money are the unquality things—all the actions that involve not doing jobs right the first time.

“Quality is not only free, it is an honest-to-everything profit maker. Every penny you don’t spend on doing things wrong, over, or instead becomes half a penny right on the bottom line. If you concentrate on making quality certain you can probably increase your profit by an amount equal to 5 to 10 percent of your sales. That is a lot of money for free.”

Philip B. Crosby, *Quality Is Free*

To re-iterate:

“QUALITY IS FREE. IT’S NOT A GIFT...”

Thank you for your valuable time. Please share your feedback and comments as you apply your new knowledge.

Larry English

For more information about information quality and information quality resources, readings in information management, to contact us, or to order the book, explore our web site:

www.infoimpact.com

